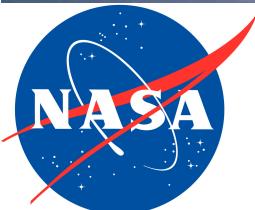


# Cloud and shadow detection

(with a primer on cloud retrievals)

Lazaros Oreopoulos (NASA-GSFC)  
with contributions by Mike Wilson, Kerry Meyer, and John Gasch

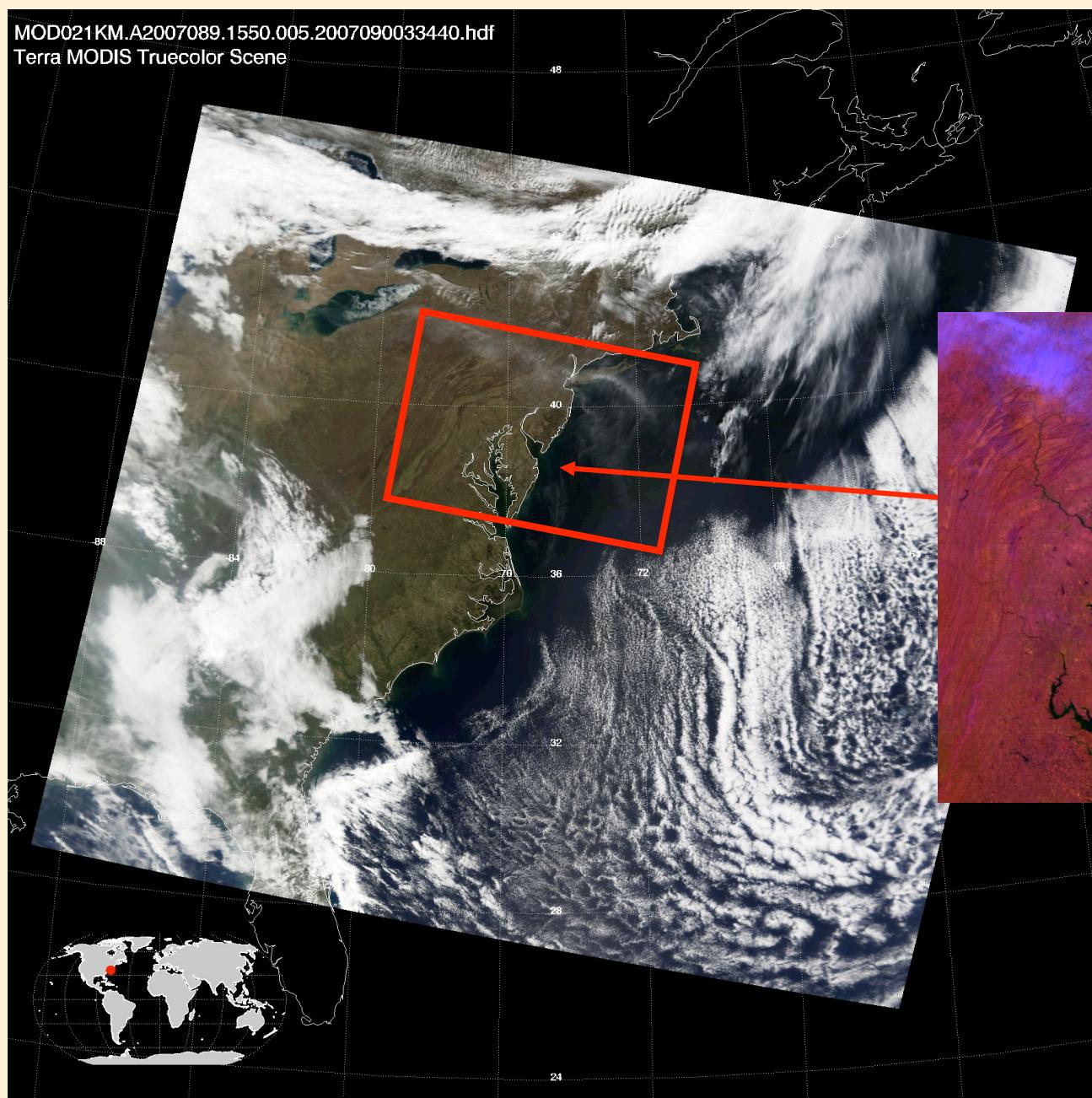
- ✓ Thin cirrus detection thresholds
- ✓ Simple cloud and shadow masking
- ✓ L7 ACCA and MODIS CF comparisons
- ✓ Cloud property retrievals



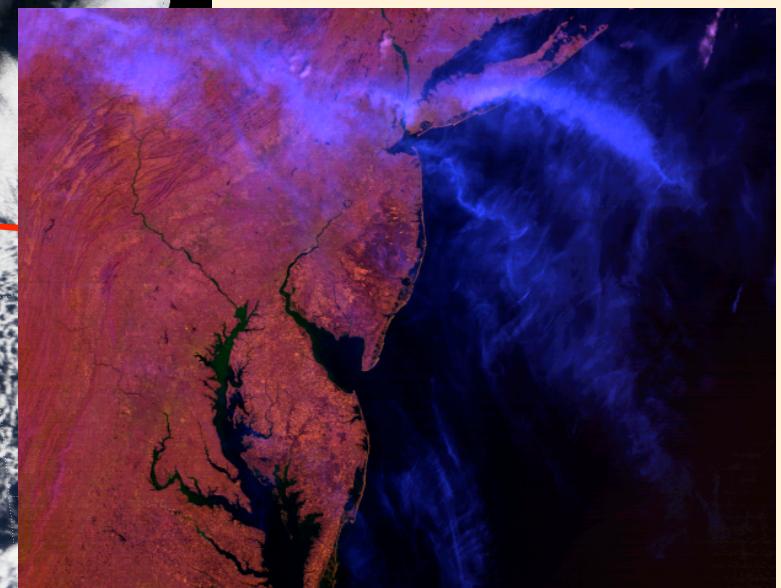
# Setting Cirrus detection thresholds

# Jersey Cirrus Case (courtesy of Kerry Meyer)

MOD021KM.A2007089.1550.005.2007090033440.hdf  
Terra MODIS Truecolor Scene

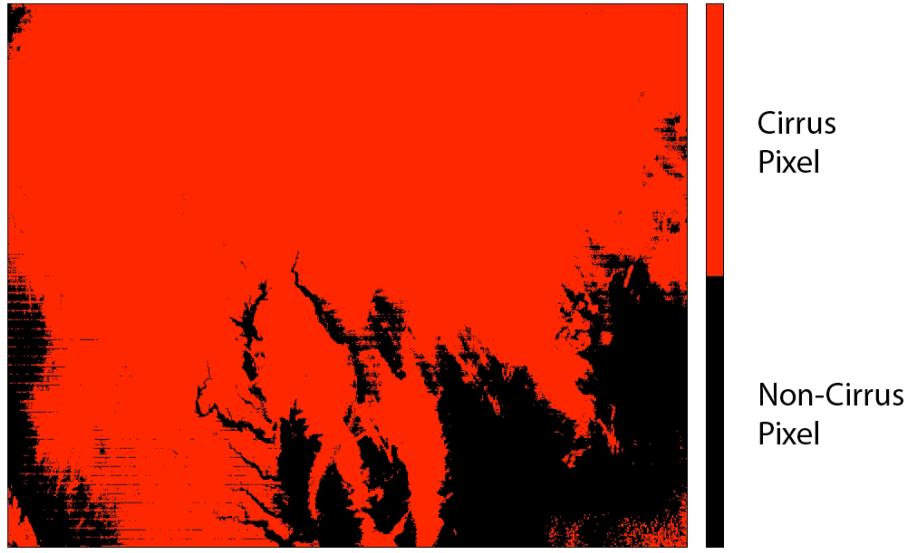


False-color image  
(R:2.1um, G:0.65um, B: 1.38um)

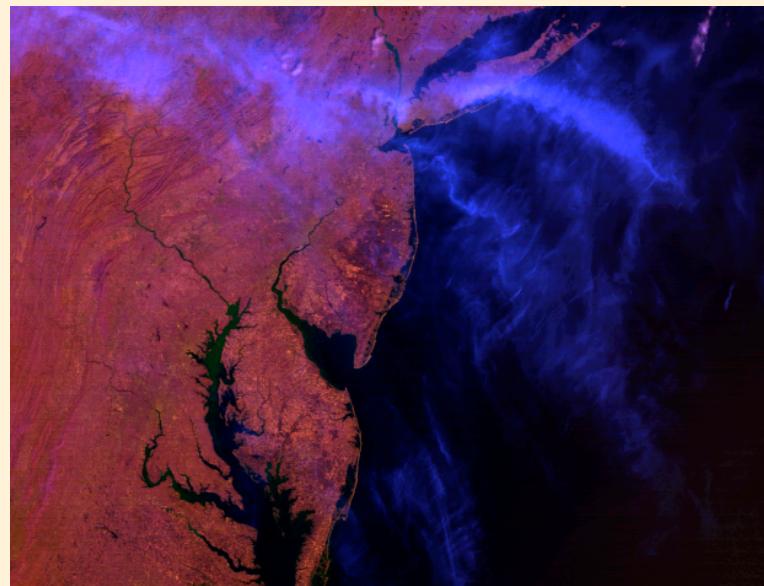
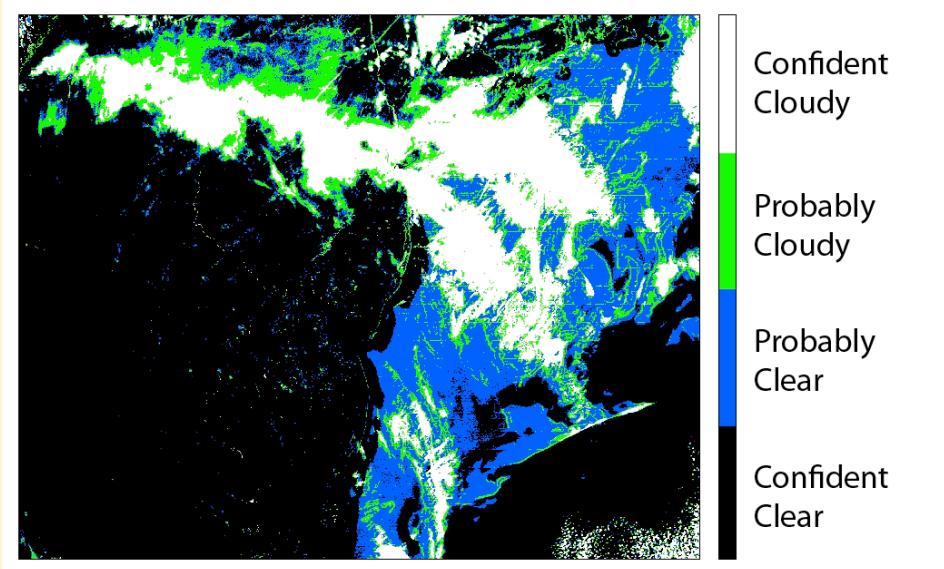


Region examined in  
following slides

## Cirrus Reflectance Flag



## MOD06 Cloud Mask



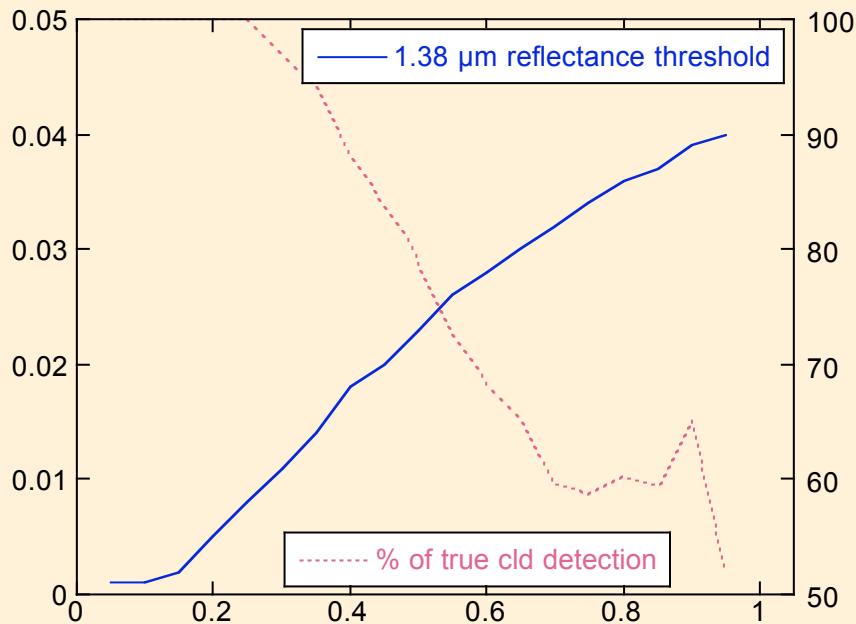
# Setting thresholds for cirrus detection

## (1.38 $\mu\text{m}$ simulations with DISORT tool)

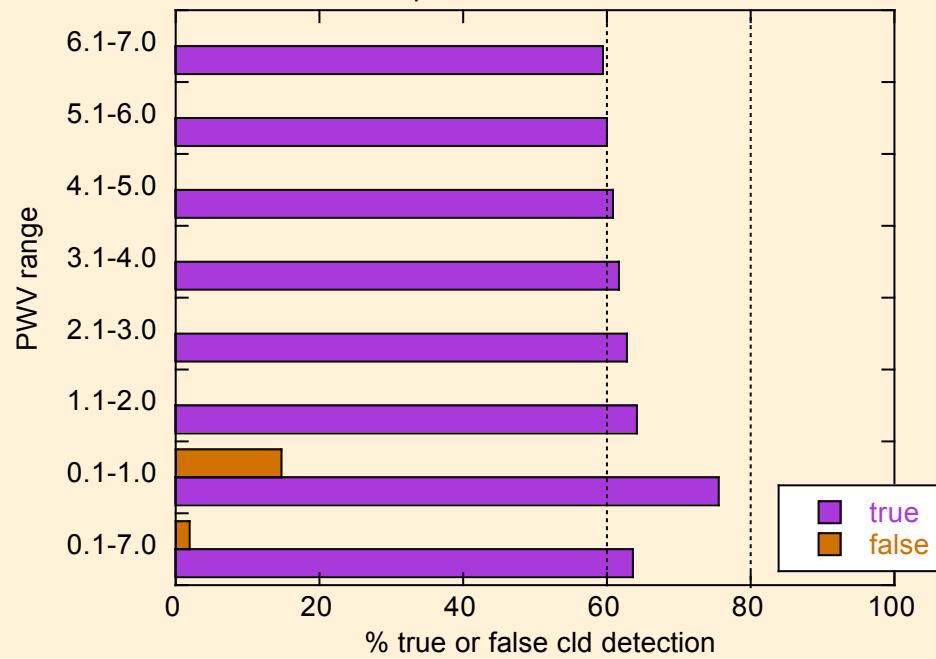
- **Summary of simulations performed:**
- Cirrus clouds with ice crystal effective diameter  $d=50, 60, 70 \mu\text{m}$ , optical depth  $\text{OD}=0.1, 0.2, 0.3, 0.4, 0.5, 0.6, 0.7, 0.8, 0.9, 1.0, 1.5, 2.0, 2.5\dots$
- ...placed at 8-9, 9-10, 10-11, 11-12 km layers...
- ...within 15 different atmospheres whose PWV was forced to range from 0.1 to 7.0 cm, in steps of 0.1 (the WV vertical distribution is different among the atmospheres).
- Surface albedo used was 0.1, 0.2, 0.3, 0.4.
- SZA varied from 0.05 to 0.95 in steps of 0.05.
- Obviously, the above numbers give a large number of permutations: DISORT was run  $> 12,000,000$  times!
- Runs with the above atmospheres, sfc albedos, and SZAs were also performed for clear skies ( $\sim 80$  K runs)

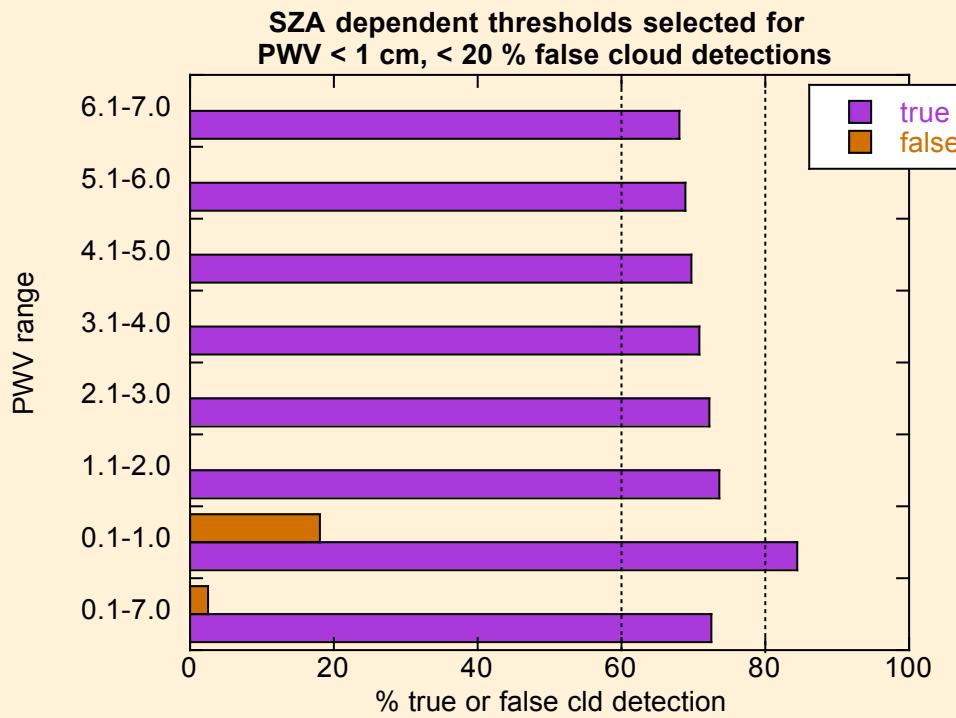
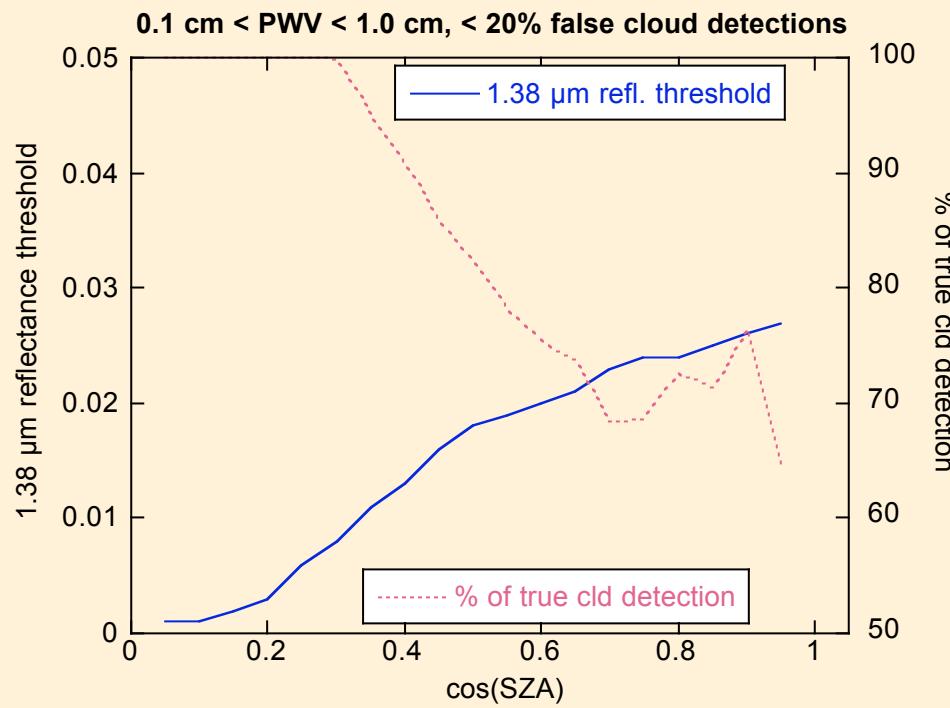
Tool courtesy of Kerry Meyer

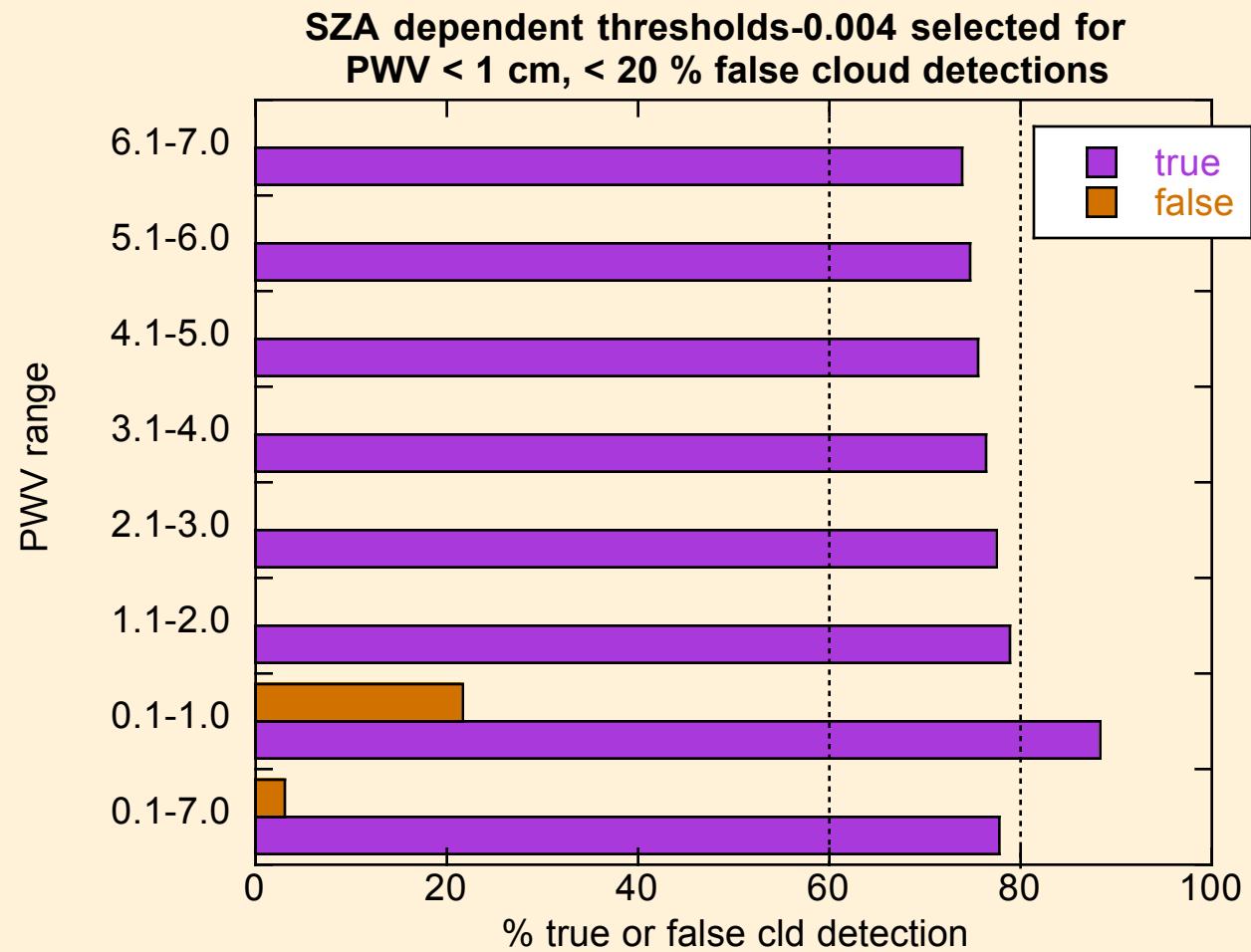
**Rsfc=0.4,  $0.1 \text{ cm} < \text{PWV} < 1.0 \text{ cm}$ , < 20% false cloud detections**

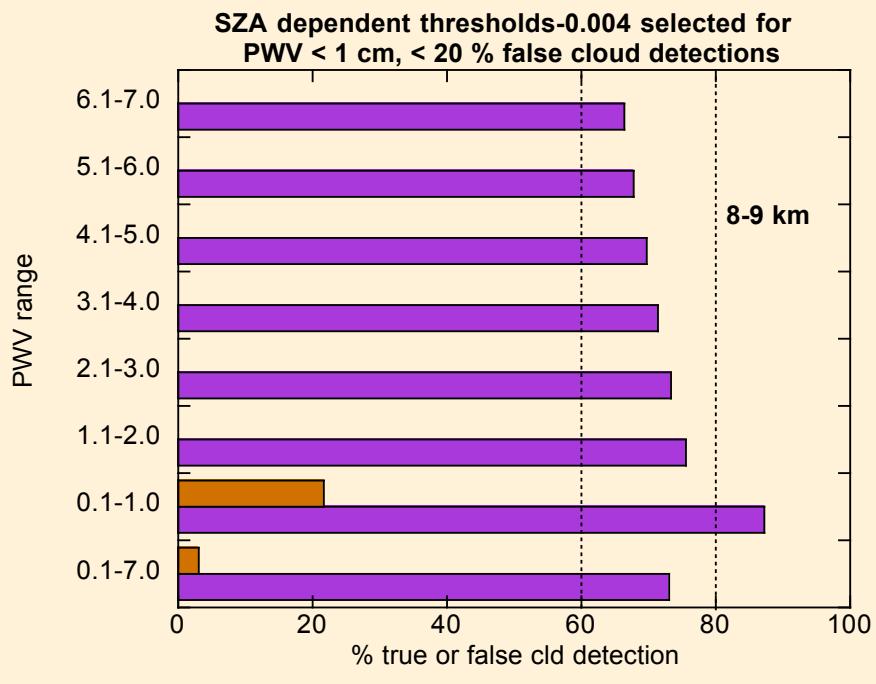
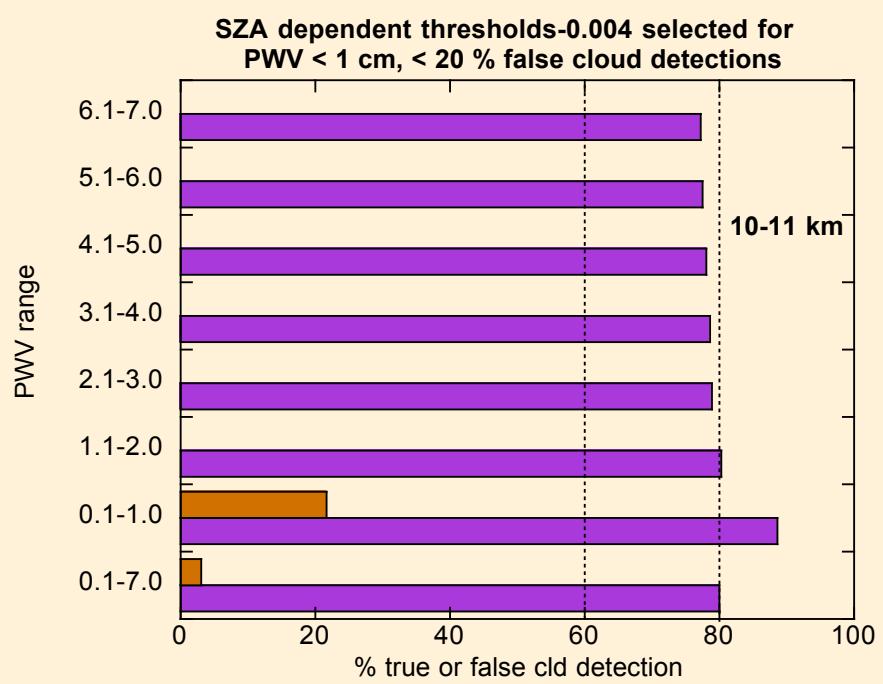
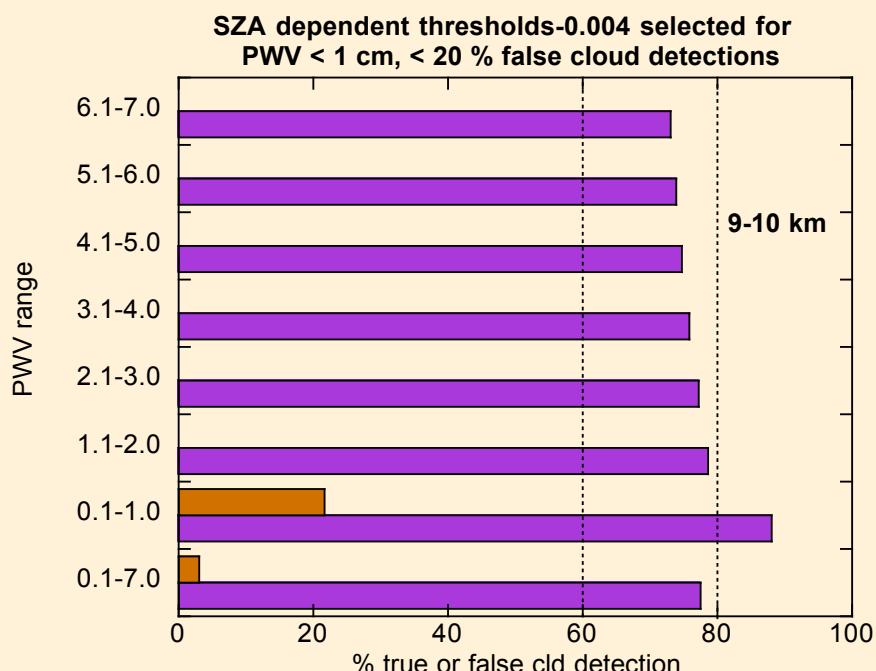
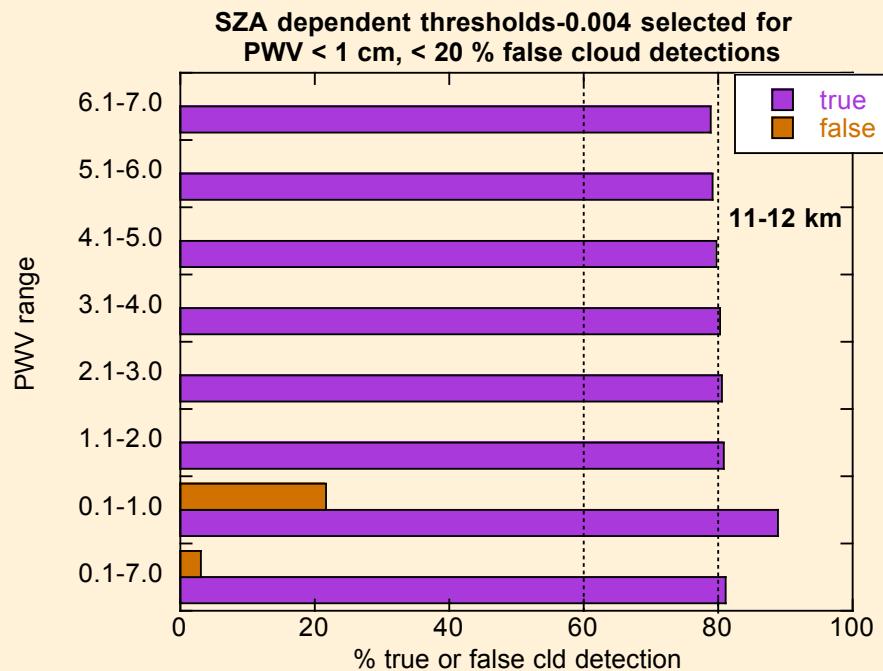


**SZA dependent thresholds selected for Rsfc=0.4,  
PWV < 1 cm, < 20 % false cloud detections**

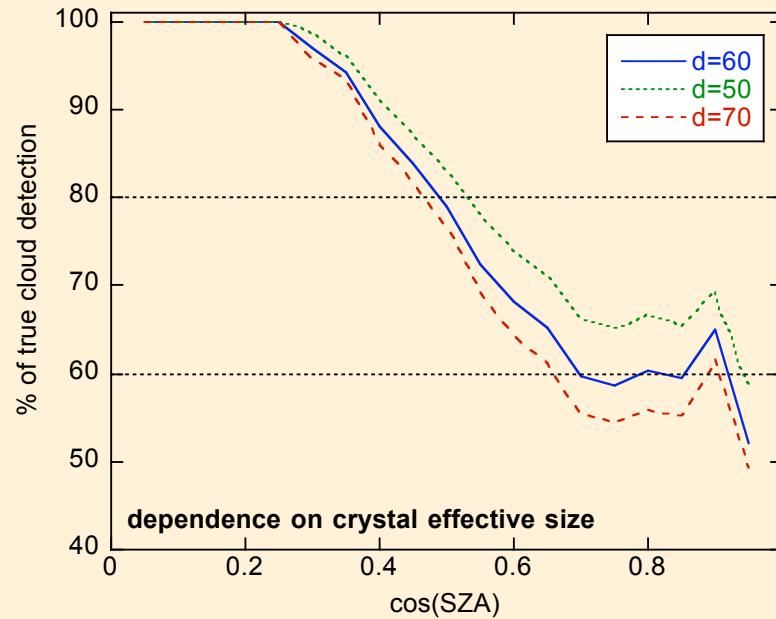




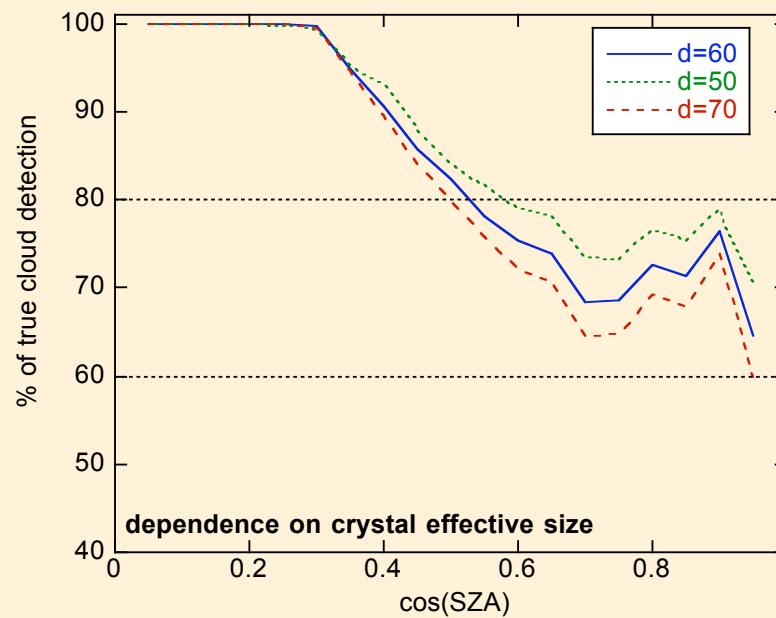




**Rsfc=0.4, 0.1 cm < PWV < 1.0 cm, < 20% false cloud detections**

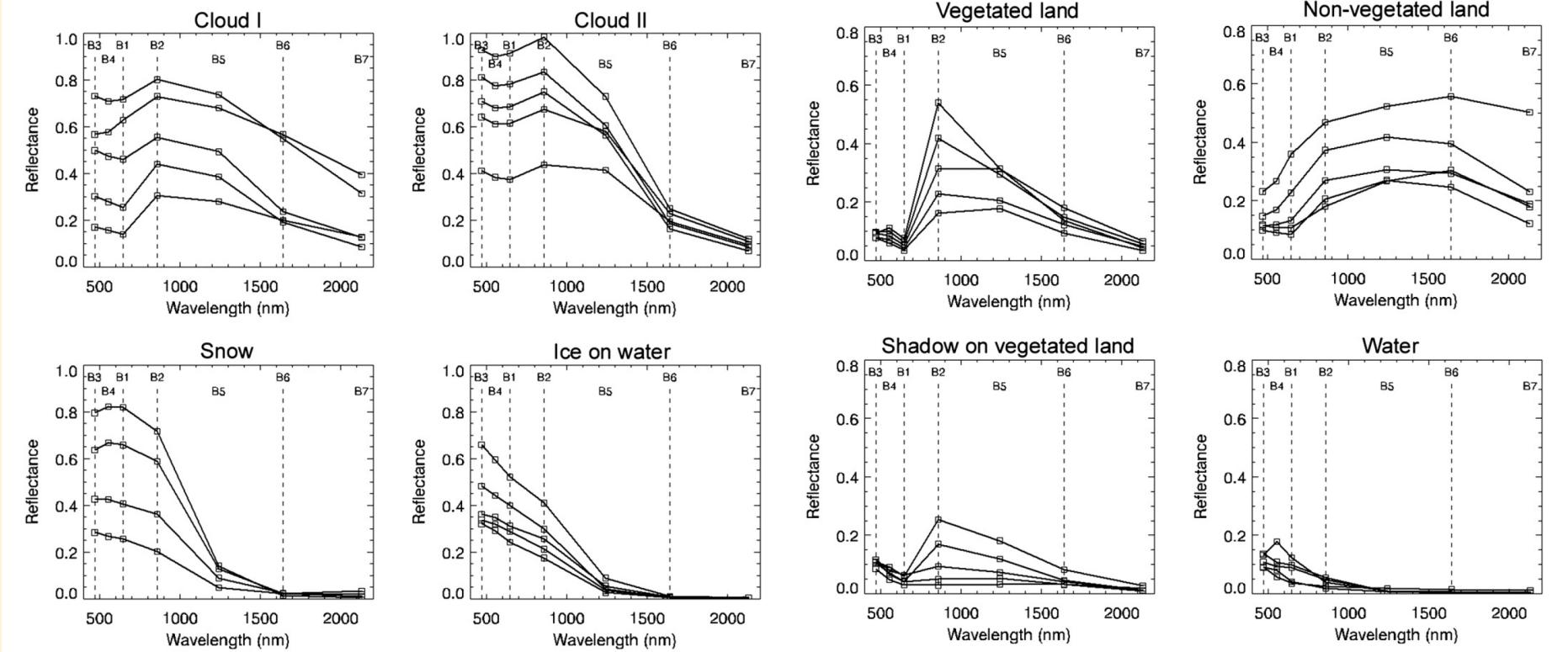


**0.1 cm < PWV < 1.0 cm, < 20% false cloud detections**

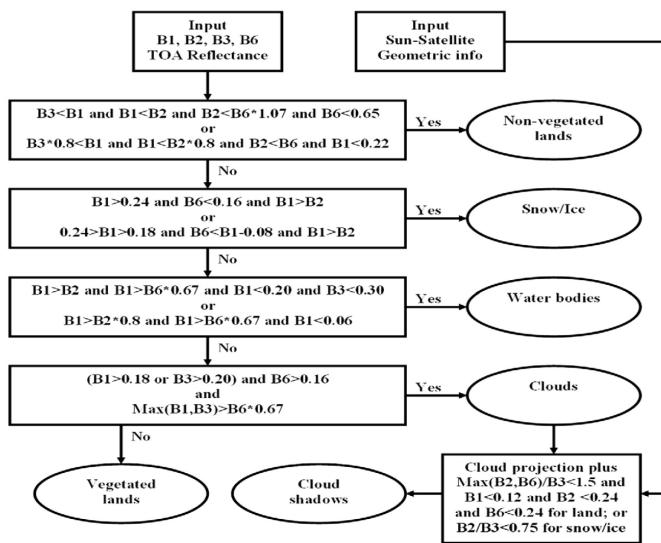


# Simple cloud mask tests

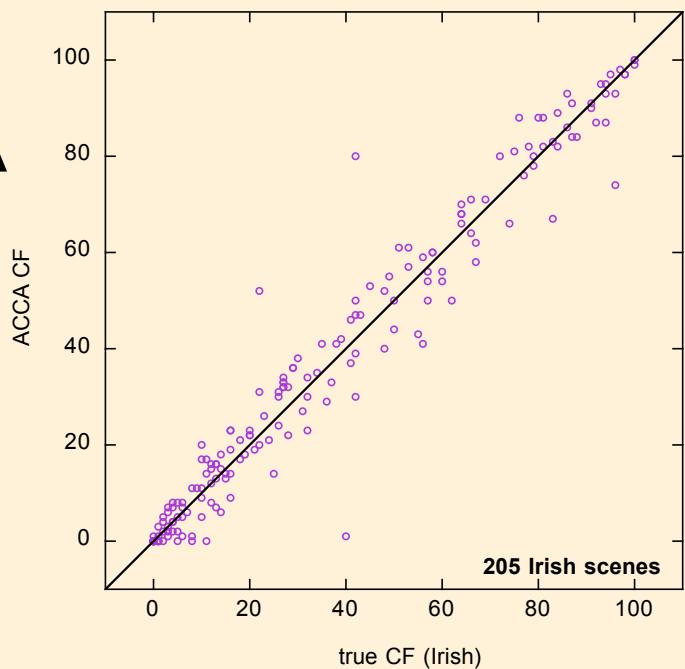
# A simple algorithm with no thermal



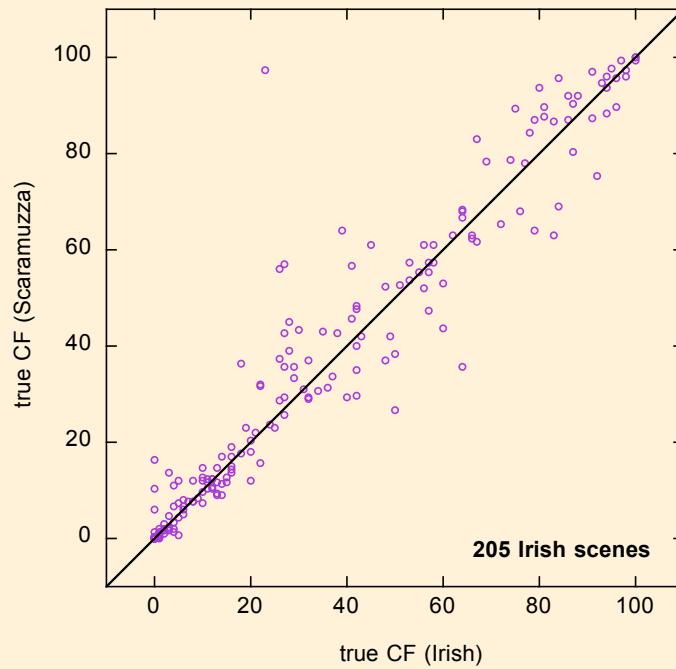
Luo et al., RSE (2008)



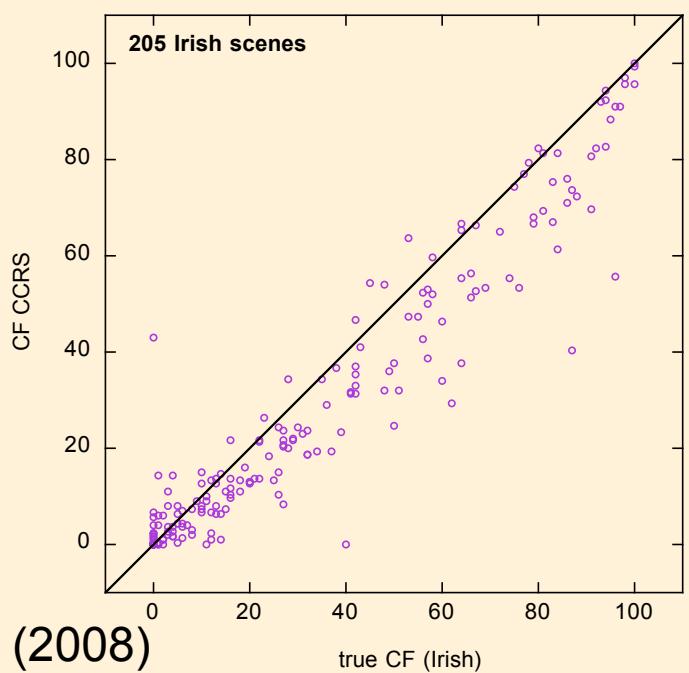
ACCA



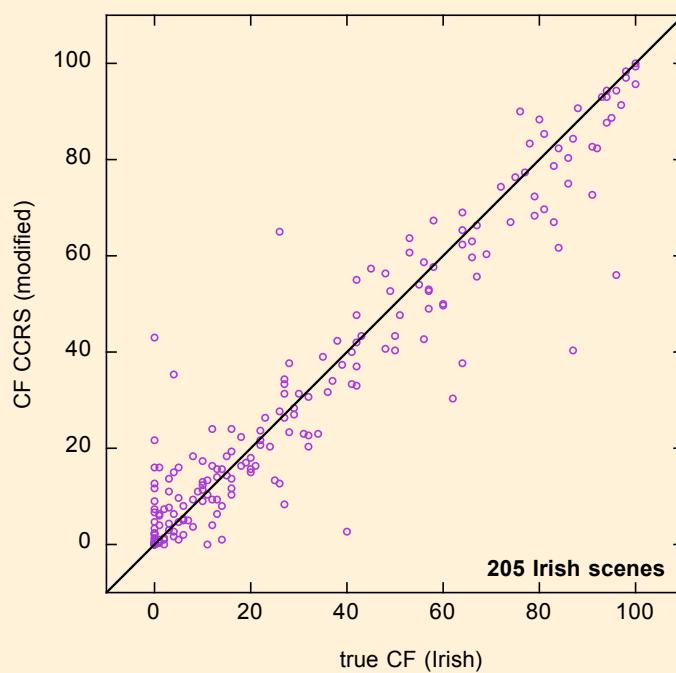
Scara



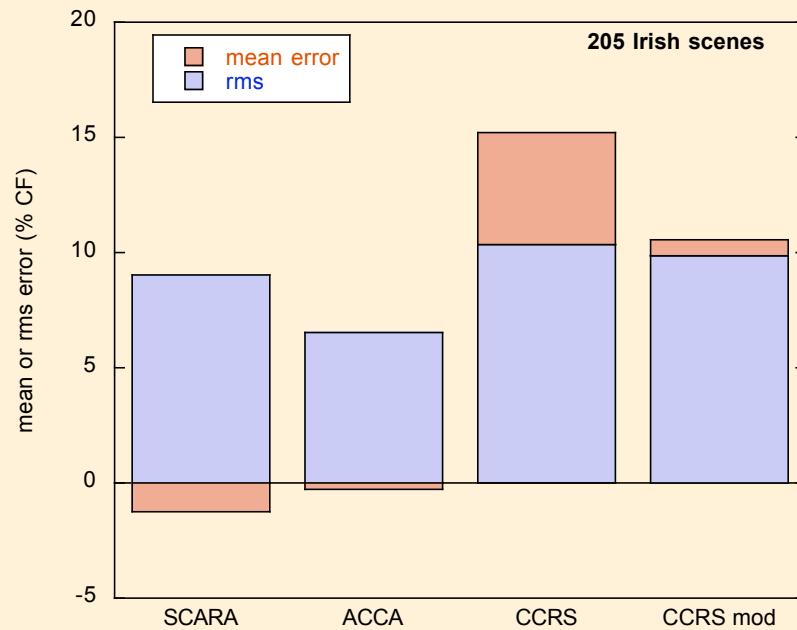
CCRS



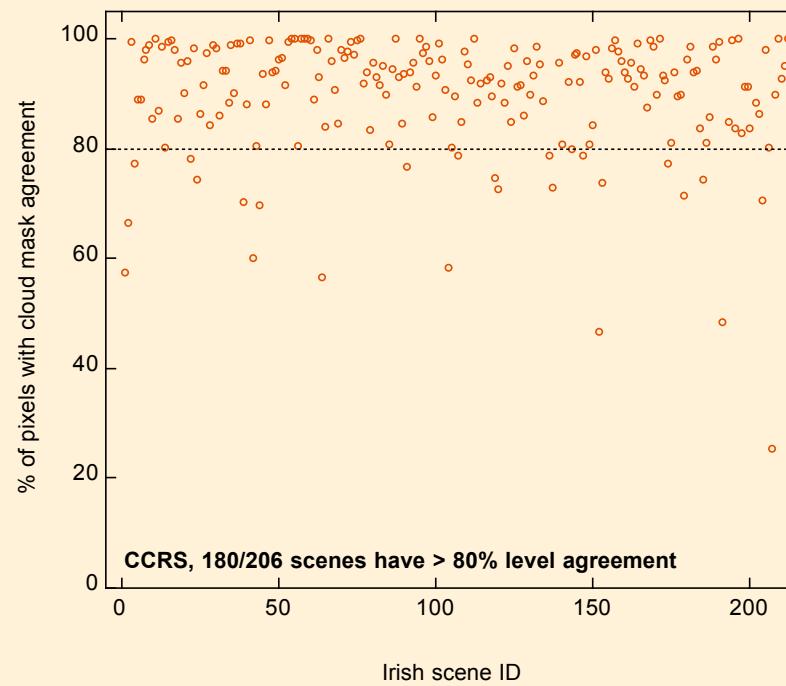
CCRS  
mod



Luo et al. (2008)



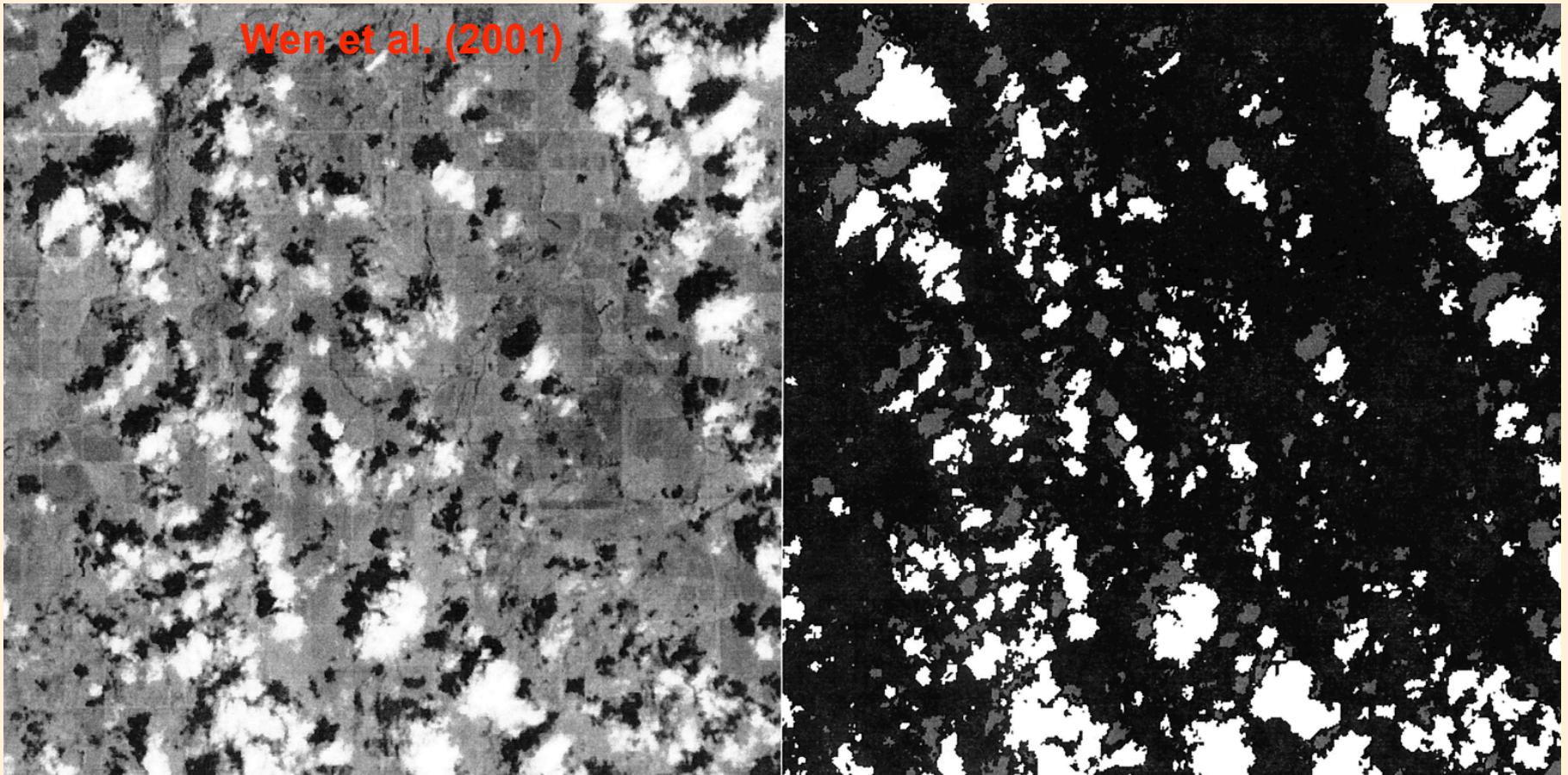
Score comparison



Mask comparison

# Cloud shadows

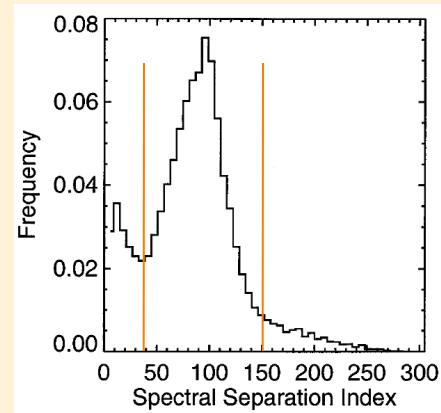
# Spectral Separation Index (SSI)



$$SSI = \frac{\mathbf{P} \cdot \mathbf{I}}{r_2^2}$$

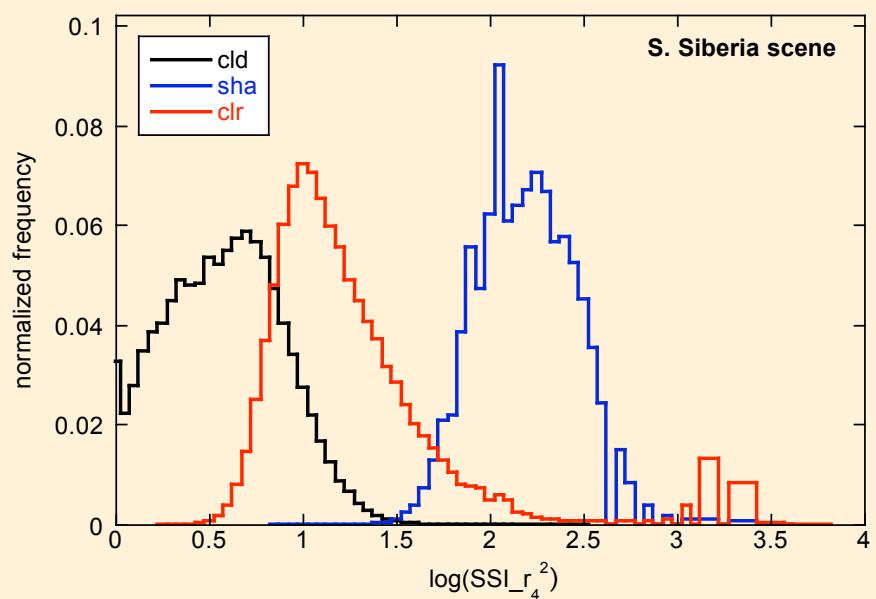
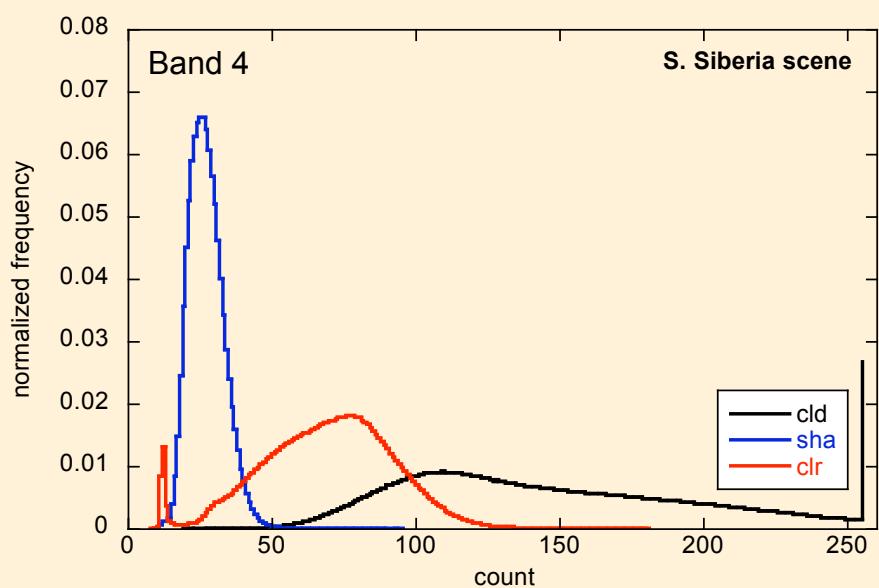
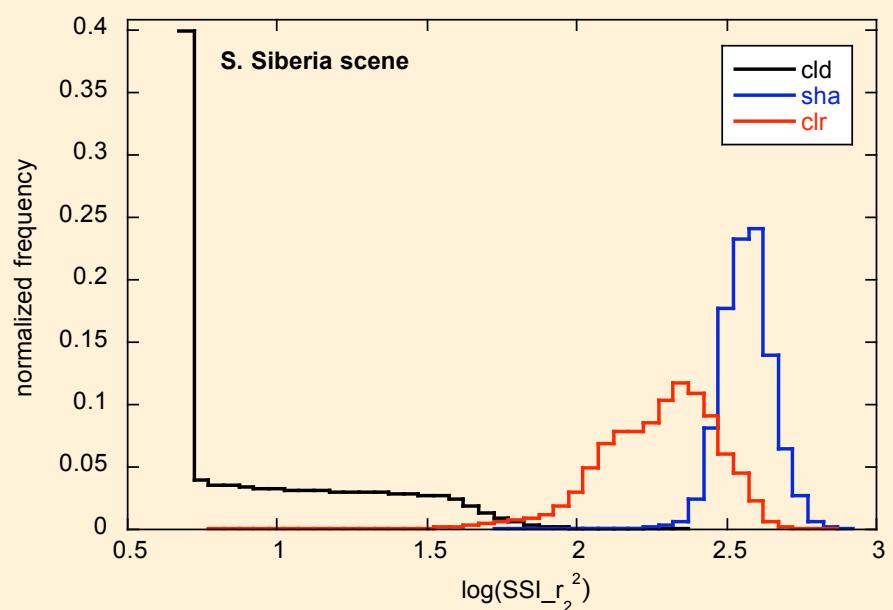
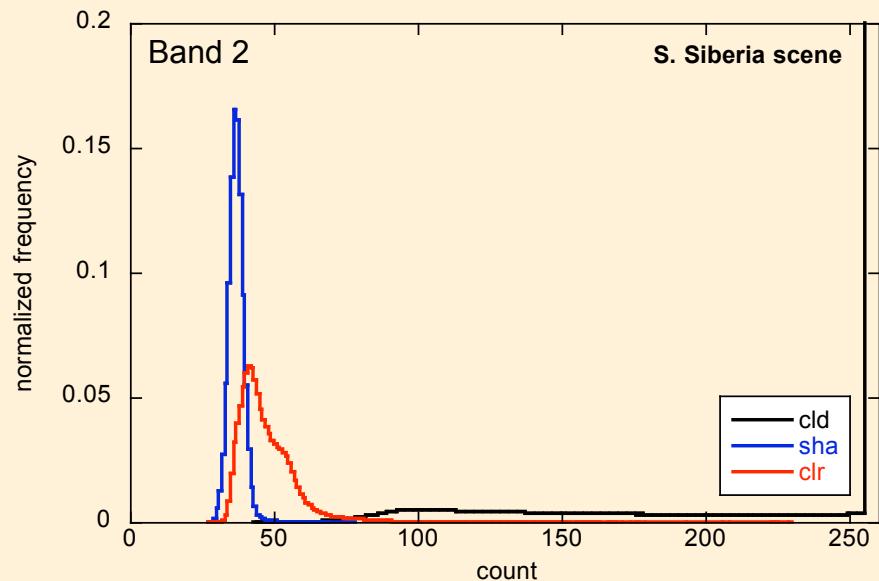
$$\mathbf{P} = \frac{(r_2, r_4)}{\sqrt{r_2^2 + r_4^2}}$$

$$\mathbf{I} = \left( \frac{1}{\sqrt{2}}, \frac{1}{\sqrt{2}} \right)^T$$

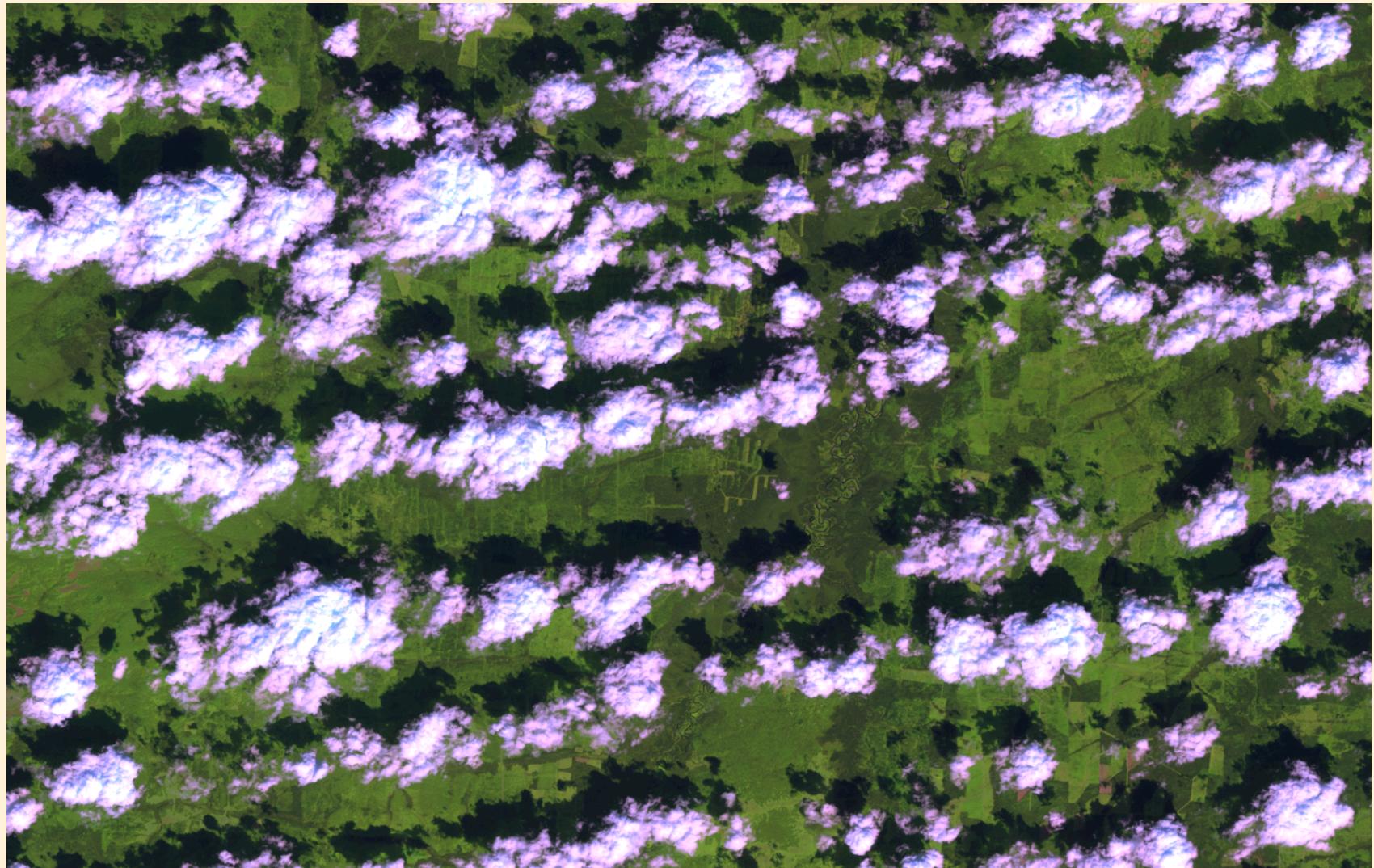


$$SSI = \frac{r_2 + r_4}{\sqrt{2(r_2^2 + r_4^2)}} \cdot \frac{r_2^2}{r_2^2}$$

# Histogram analysis with a truth dataset

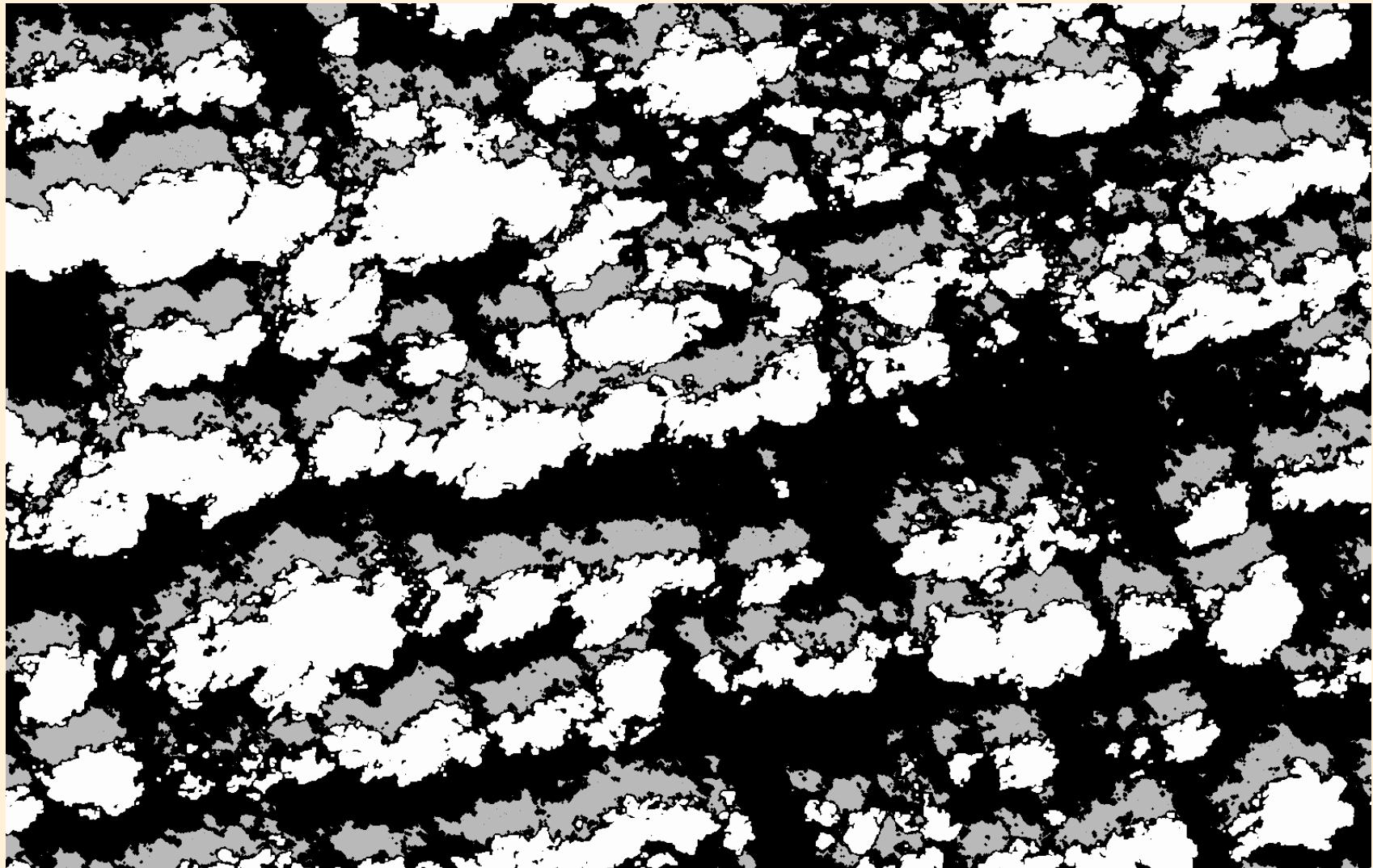


## SSI revival



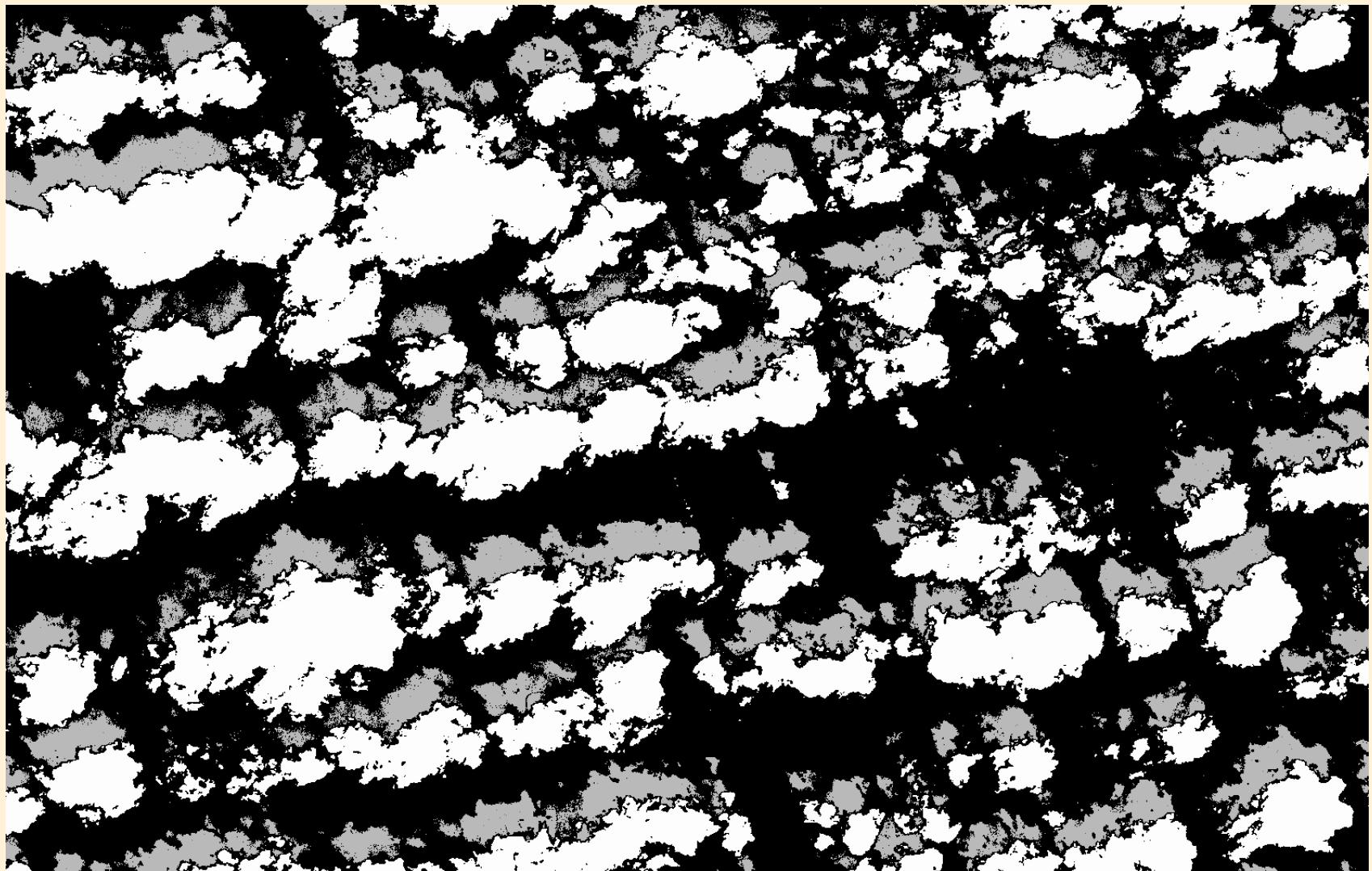
Portion of P143/R21 (southern Siberia), Aug. 3, 2001

# SSI revival

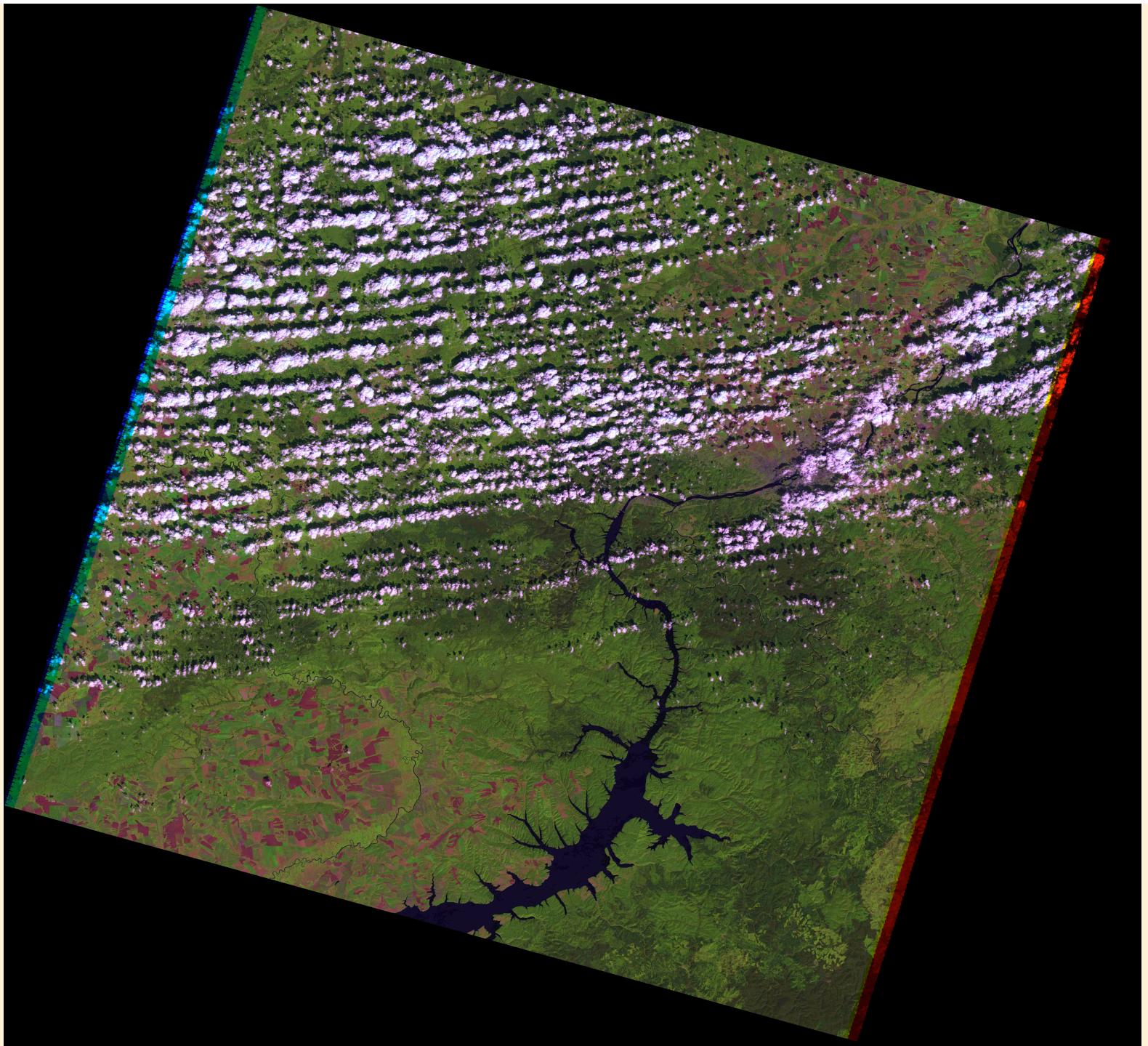


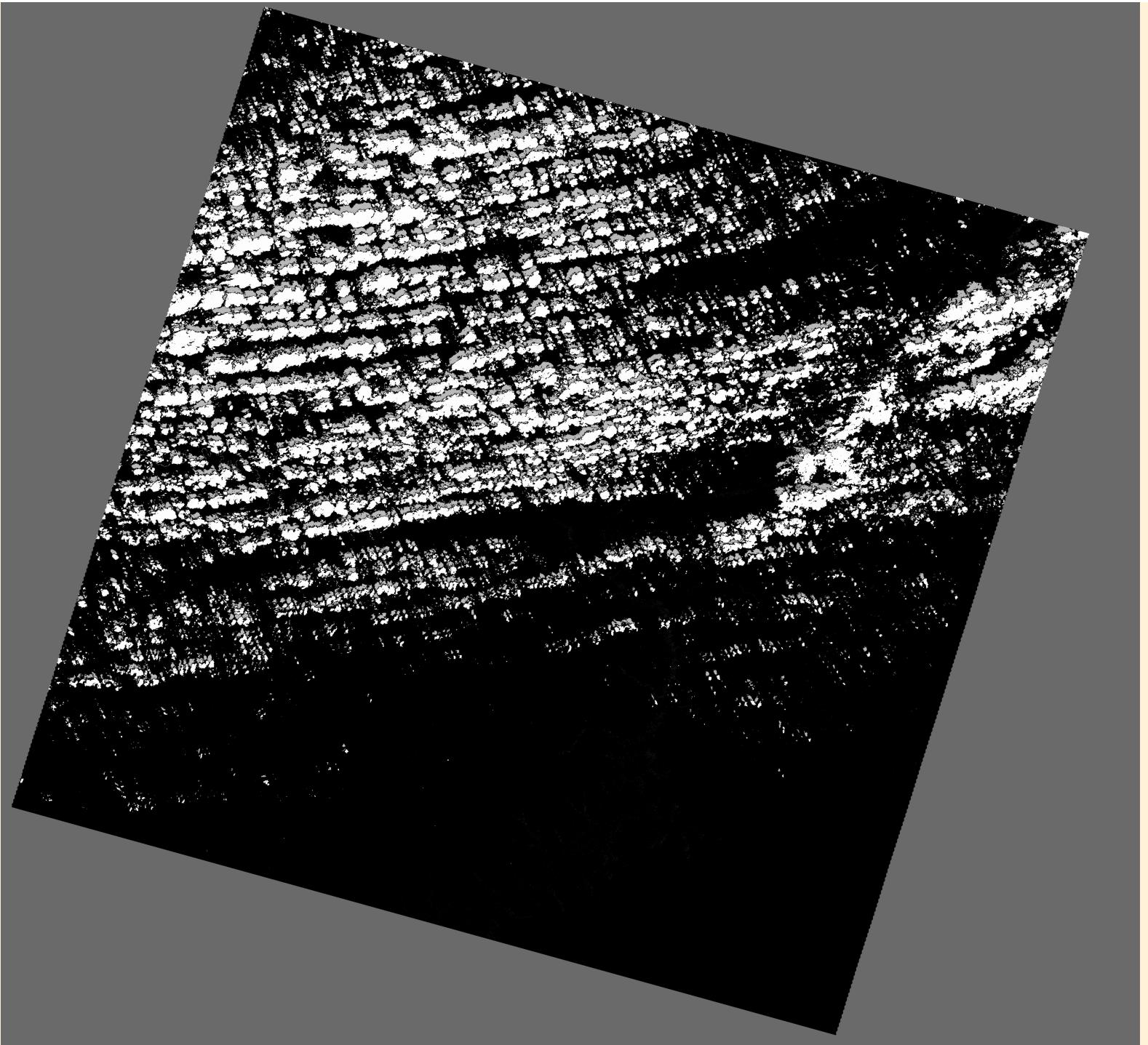
Cloud/shadow mask “truth”

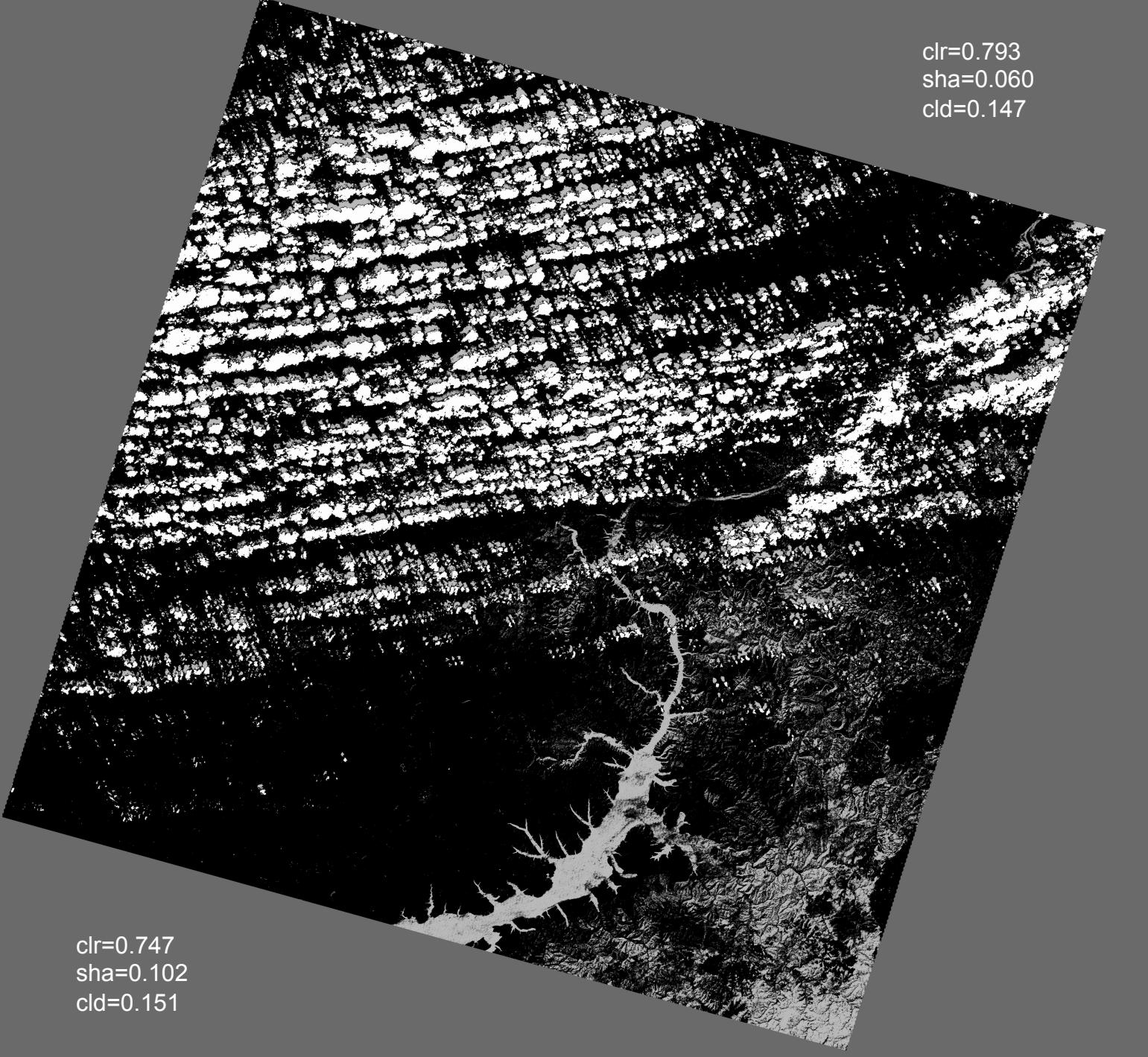
## SSI revival



SSI-based cloud/shadow mask;  $SSI_{cld}=50$ ,  $SSI_{sha}=316$



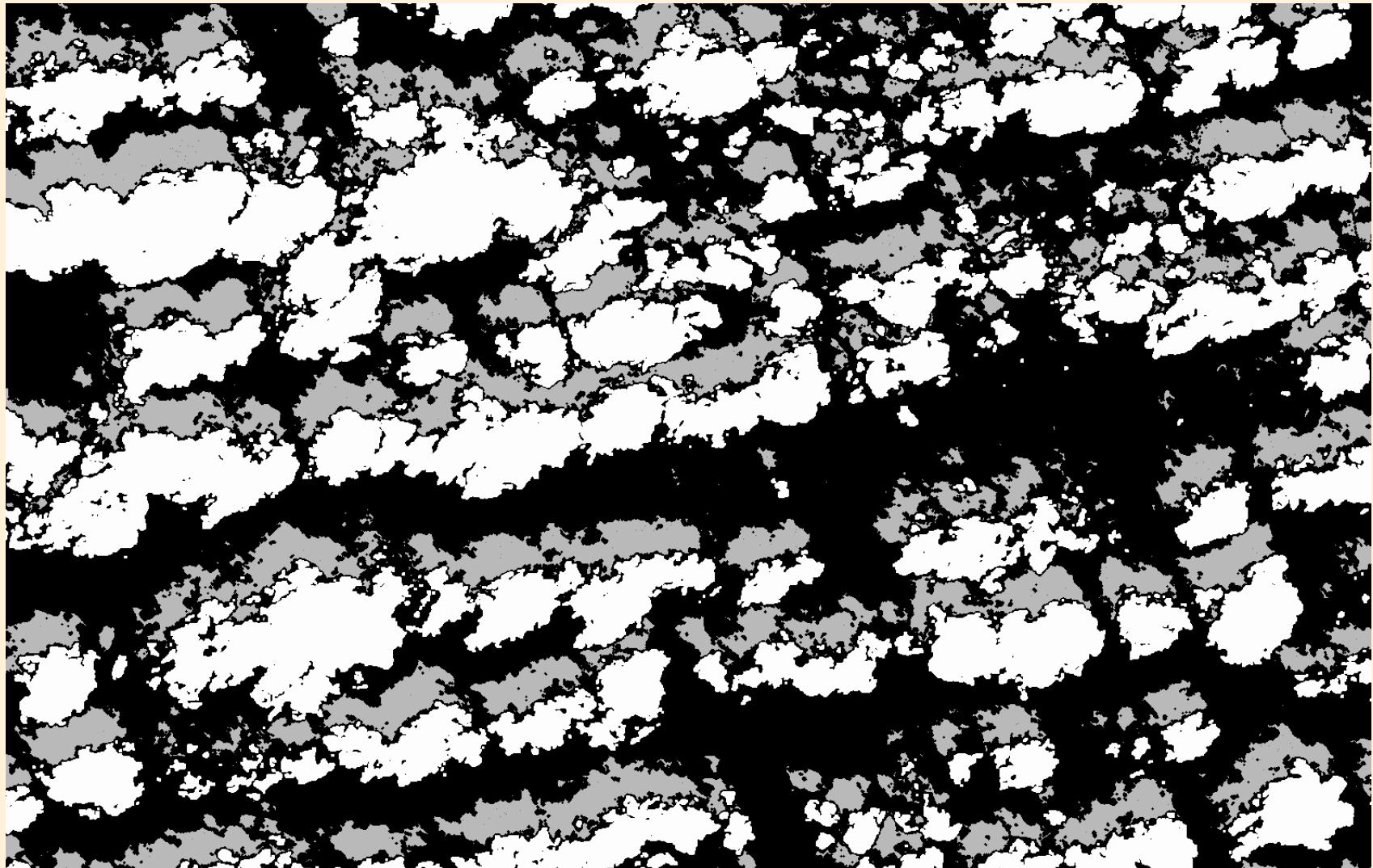




clr=0.793  
sha=0.060  
cld=0.147

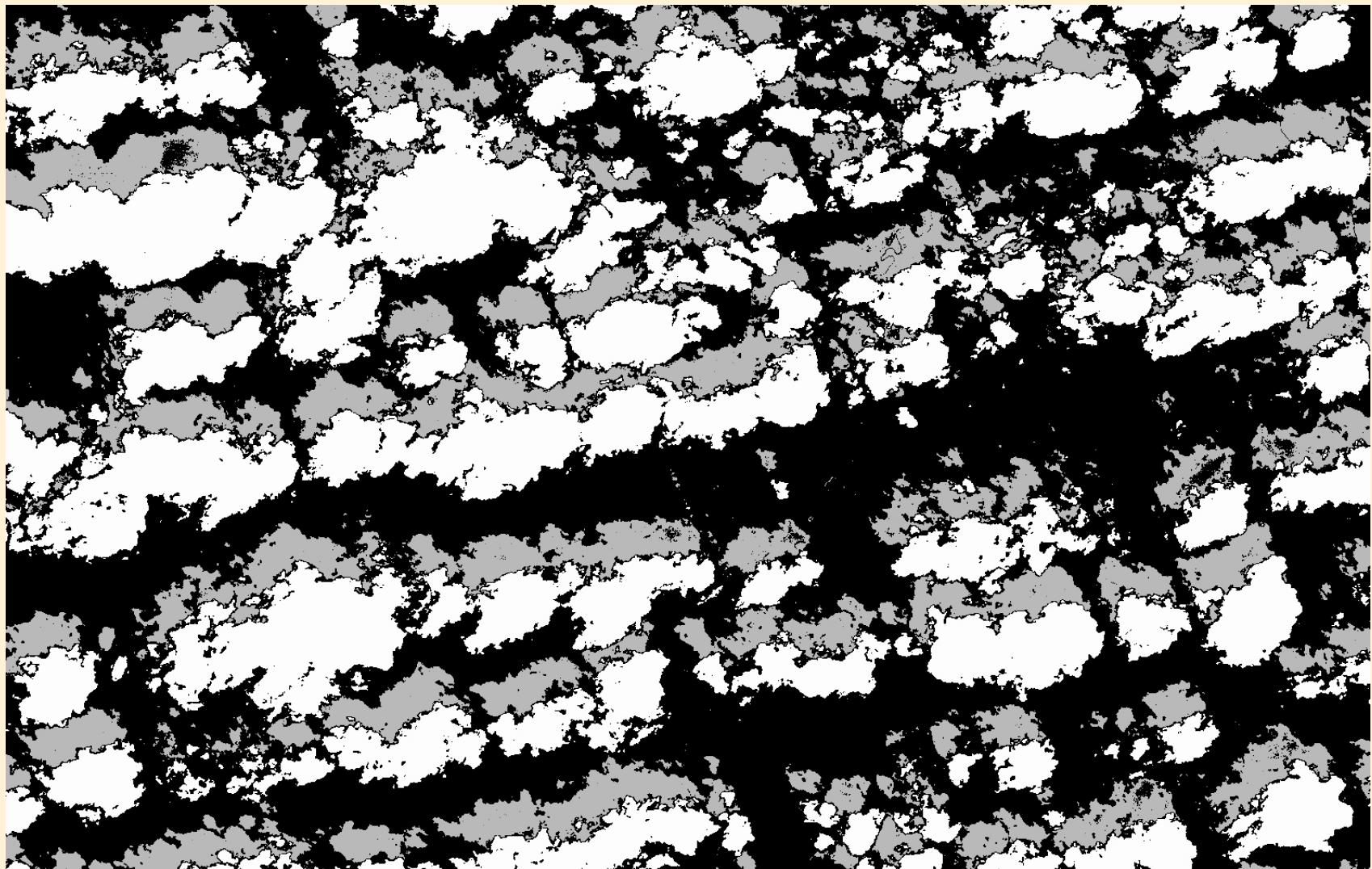
clr=0.747  
sha=0.102  
cld=0.151

# SSI revival

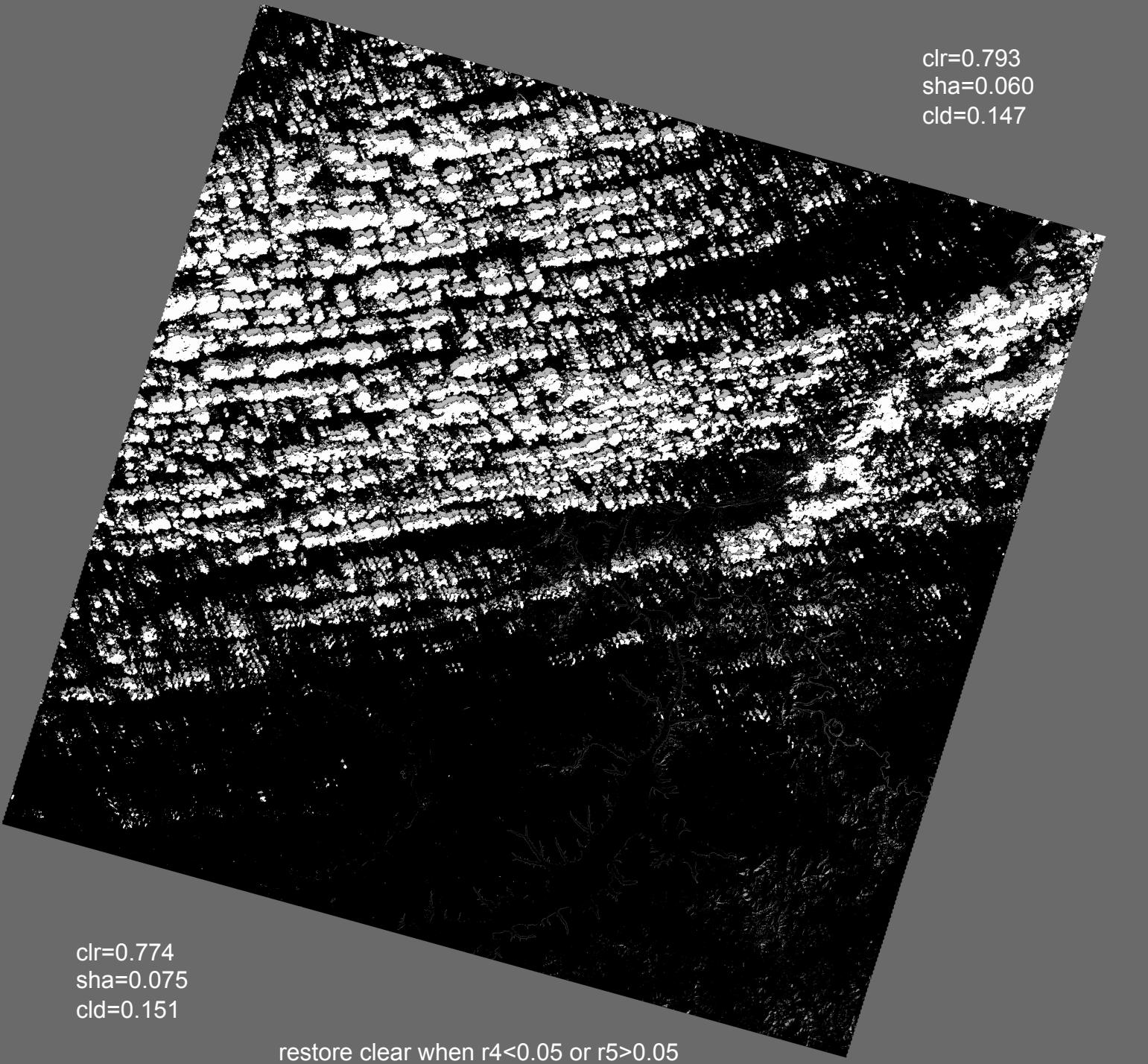


Cloud/shadow mask “truth”

## SSI revival



SSI-based cloud/shadow mask;  $\text{SSI}_{\text{cld}}=50$ ,  $\text{SSI}_{\text{sha}}=251$

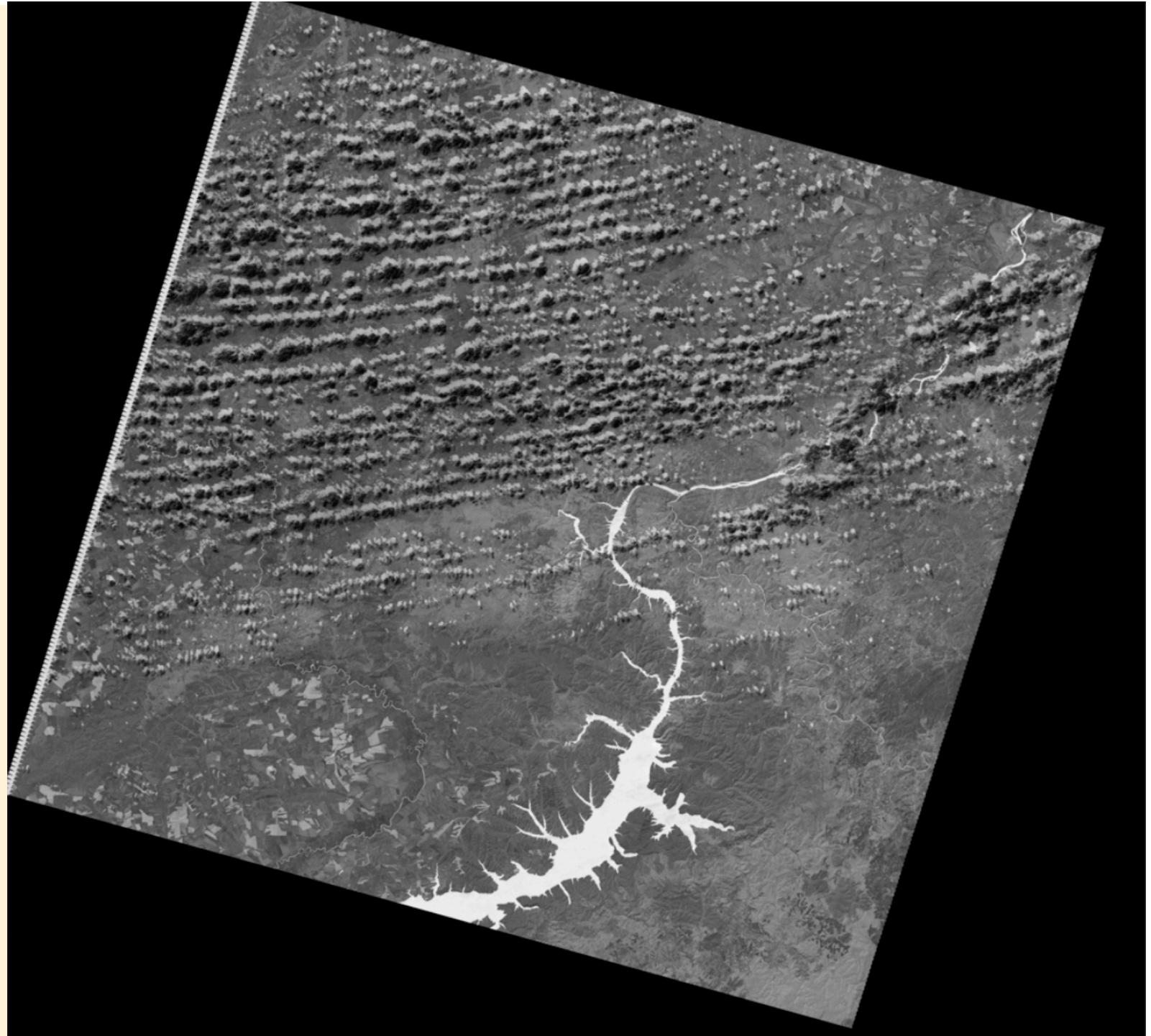


clr=0.793  
sha=0.060  
cld=0.147

clr=0.774  
sha=0.075  
cld=0.151

restore clear when  $r4 < 0.05$  or  $r5 > 0.05$

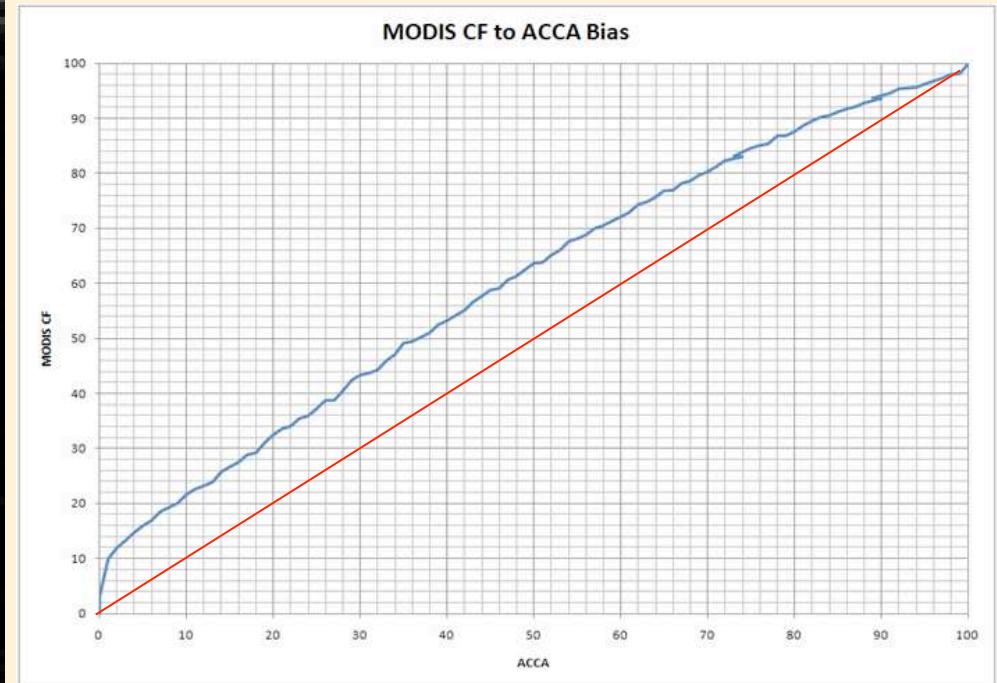
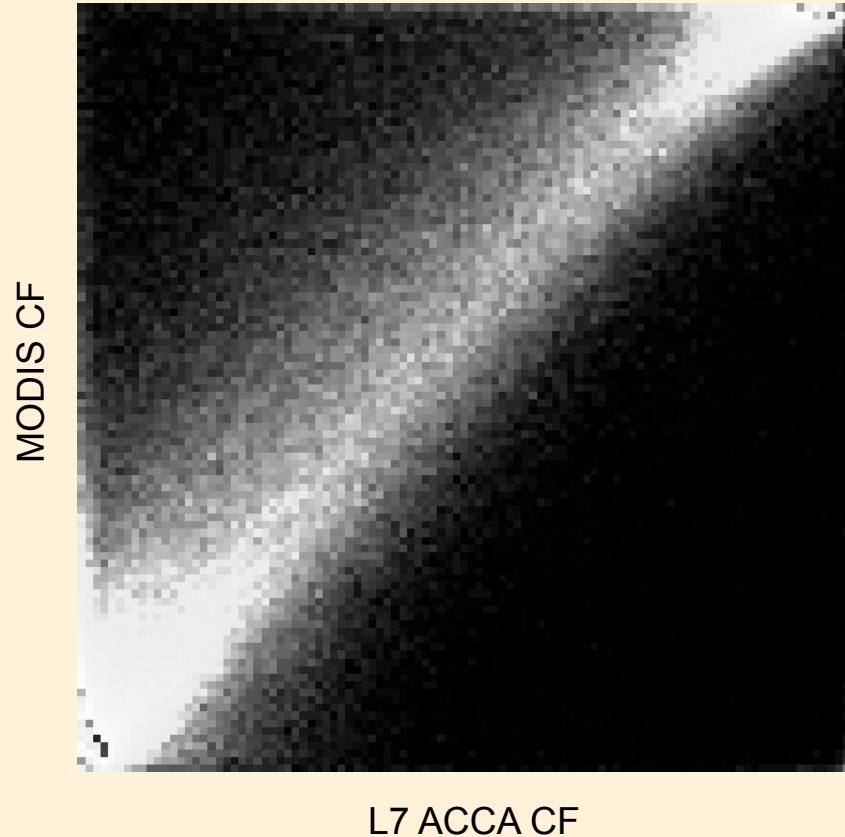
$$SSI = \frac{\frac{r_2 + r_4}{\sqrt{2(r_2^2 + r_4^2)}}}{r_4^2}$$



# MODIS-L7/ACCA CF comparisons

# MODIS-L7 comparisons (for LTAP modeling)

courtesy of John Gasch



4 yrs of data (Sep05-Sep09), ~354 K scenes

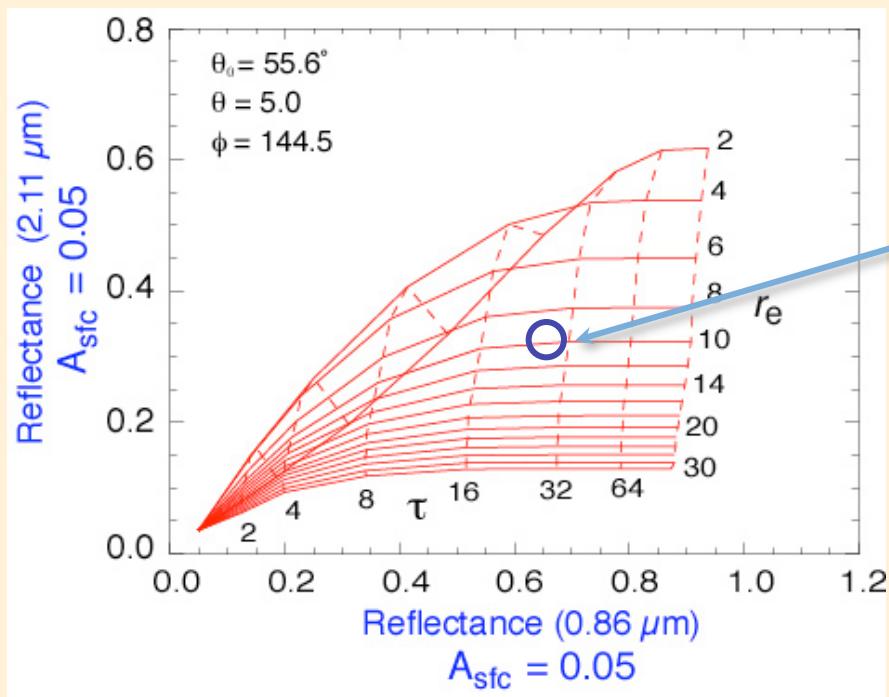
For a *Cloud Forecast Confidence* lookup table to be integrated into the LTAP.

Appropriately normalized MODIS CFs will be used in LTAP simulations for candidate L7 scenes that were eventually not acquired

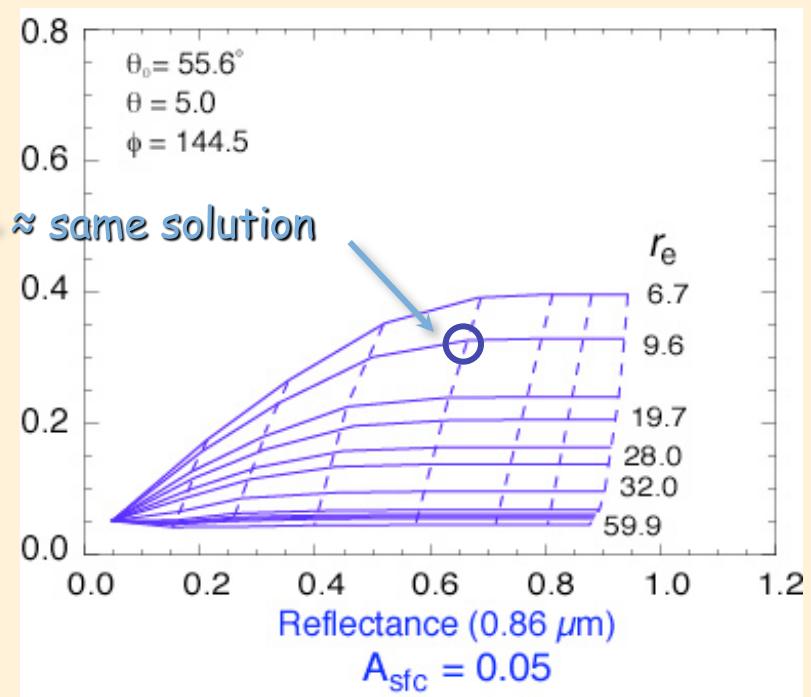
# Cloud property retrievals

# Cloud Optical & Microphysical Retrievals

## Retrieval space examples



Liquid water cloud  
ocean surface

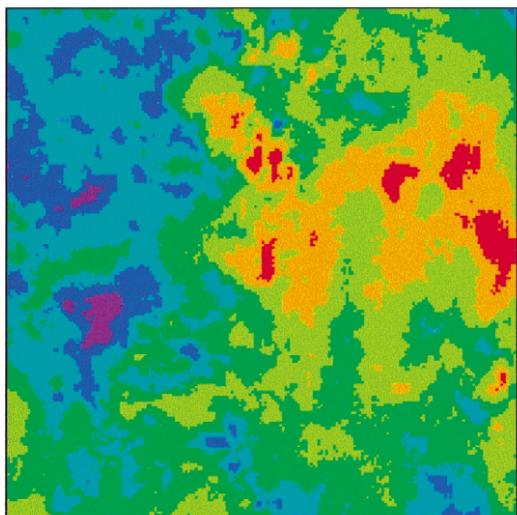


Ice cloud  
ocean surface

Based on Nakajima and King (1990) algorithm

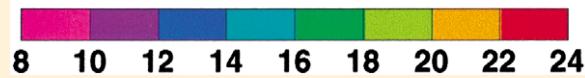
## Landsat-7 examples (Cahalan, Oreopoulos et al., 2001)

**SGP3, SZA=28°**

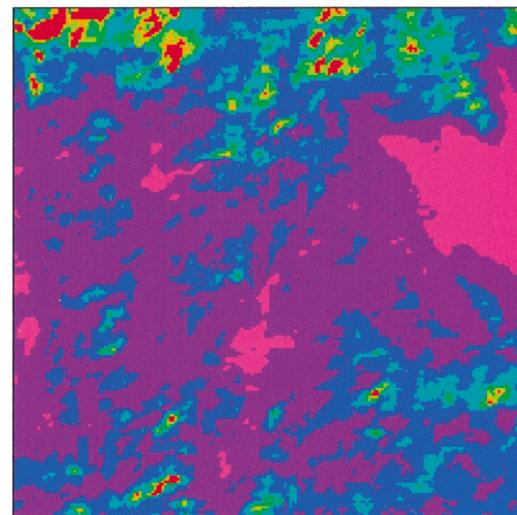


(a)

**IPA**

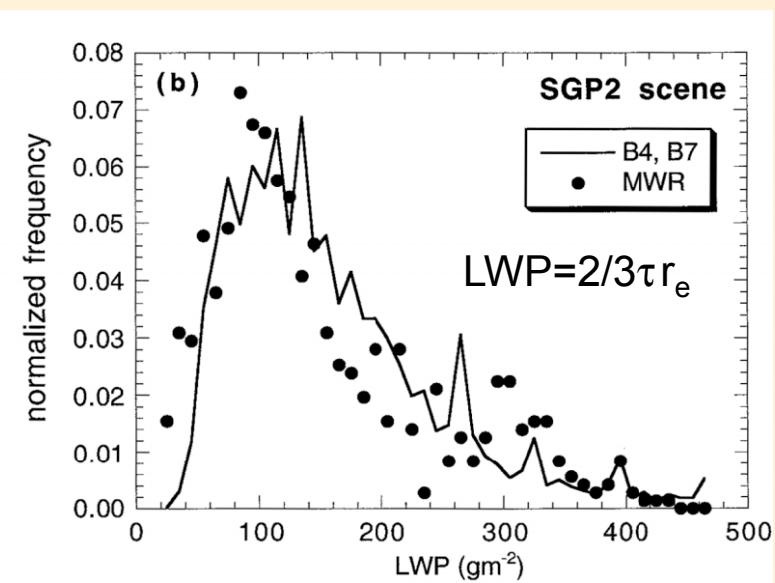
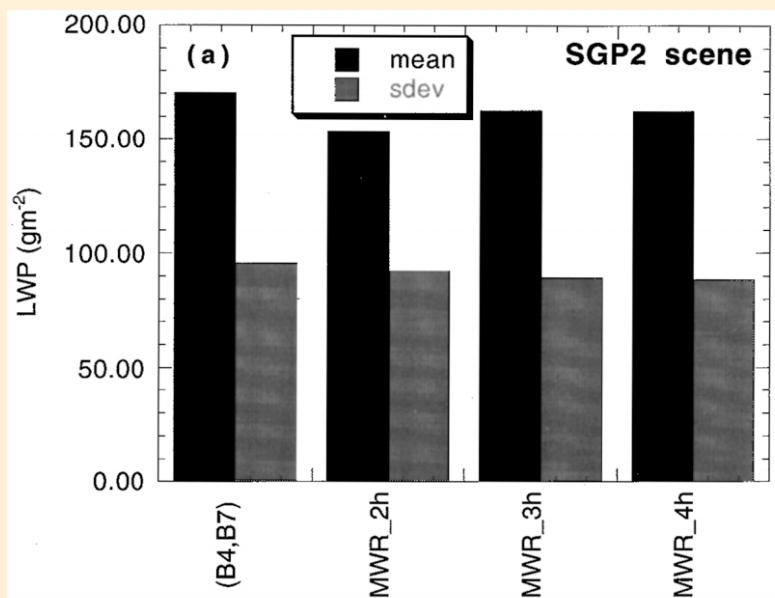
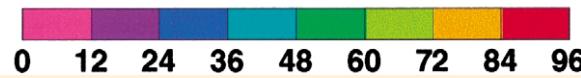


**SGP2, SZA=49°**



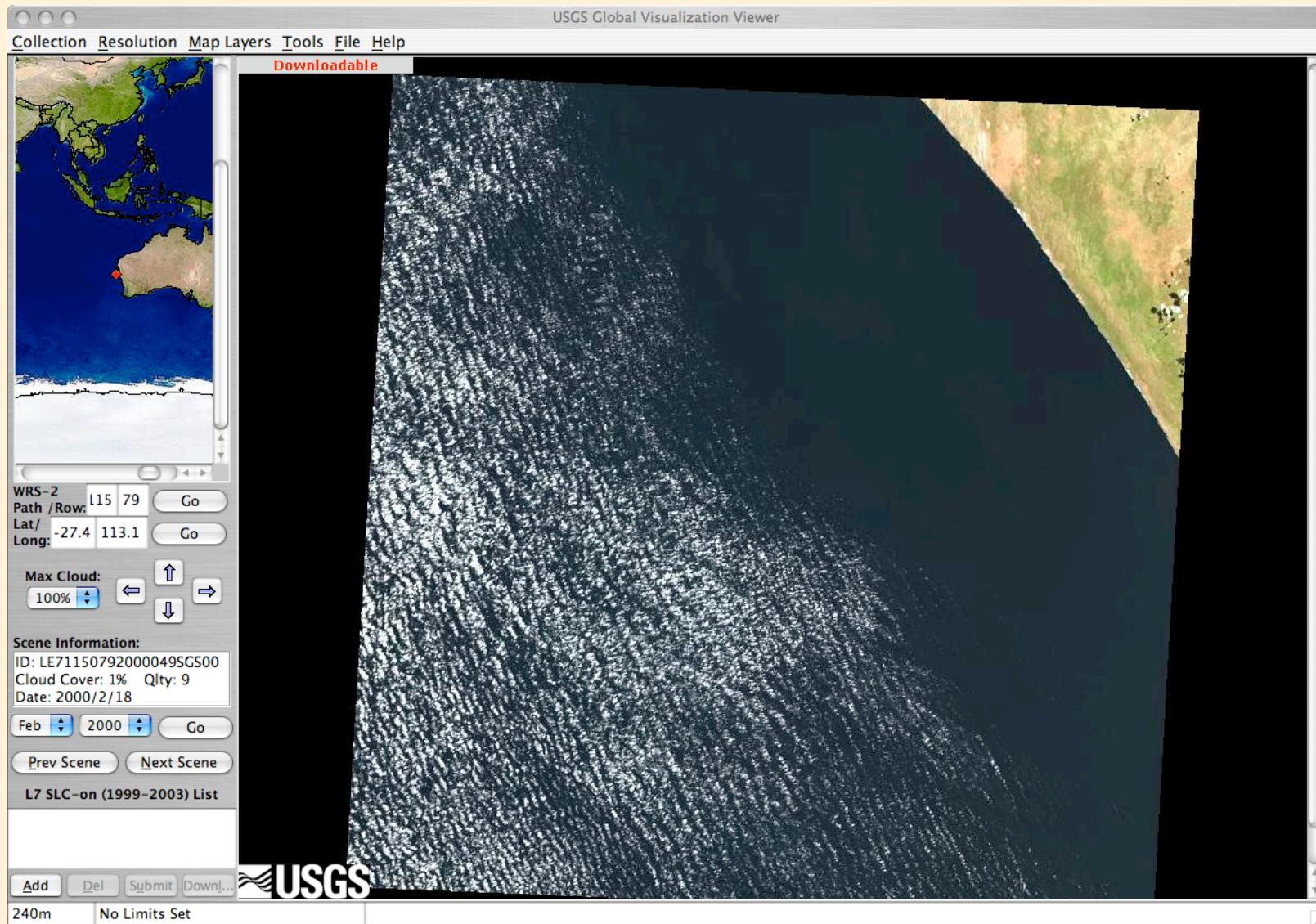
(b)

**IPA**



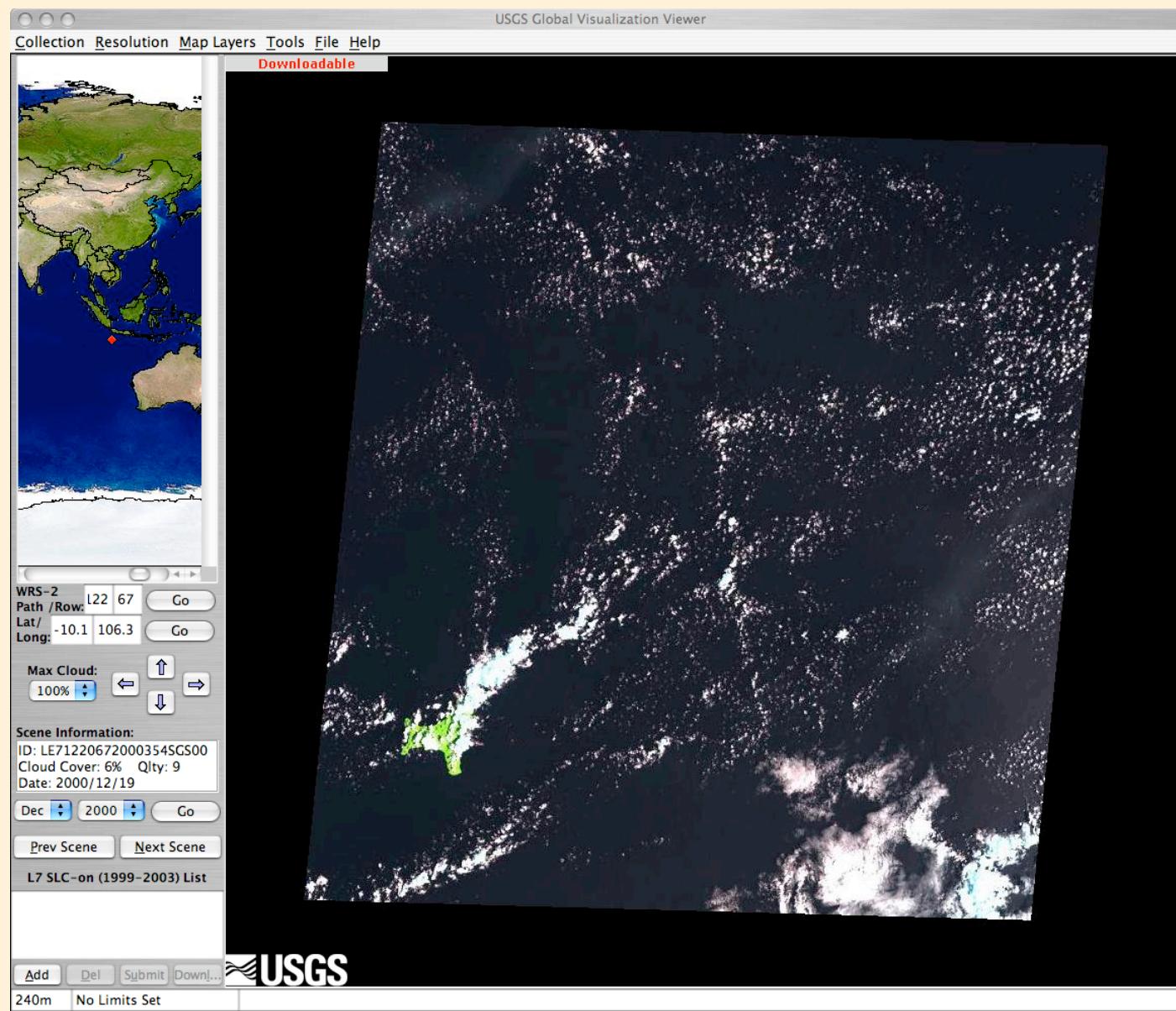
# Additional slides

# Marine cloud detection



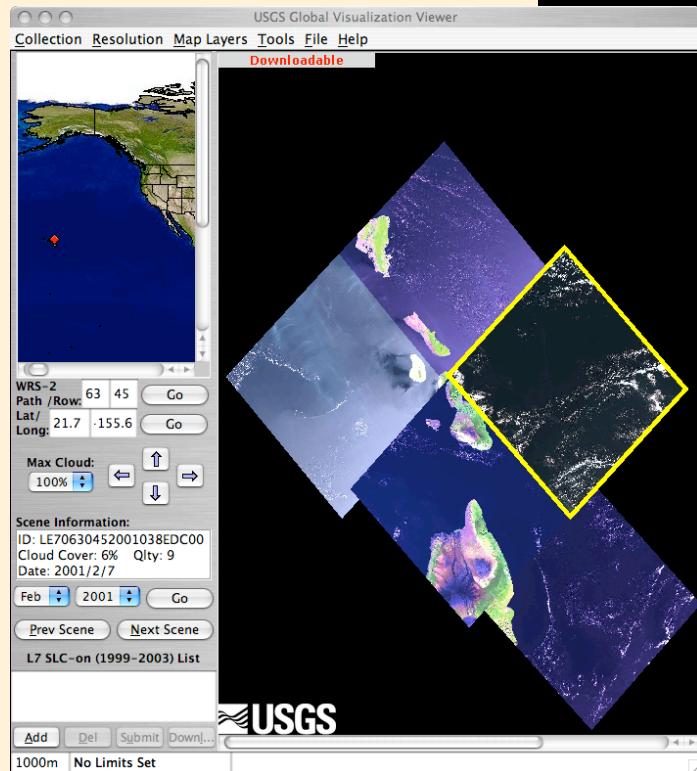
ACCA CF=1%

# ACCA underestimates Cloud Cover!

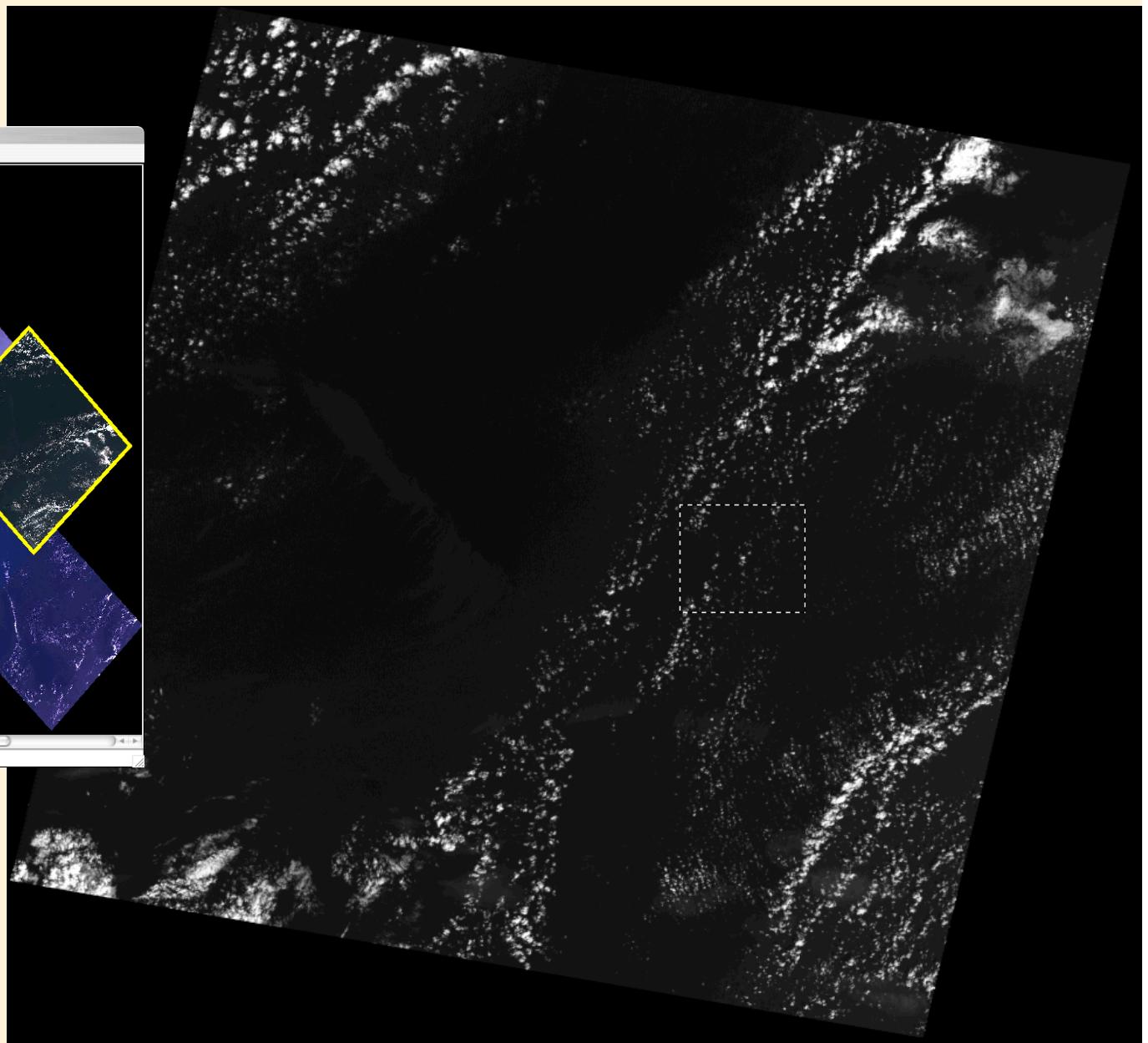


ACCA CF=6%

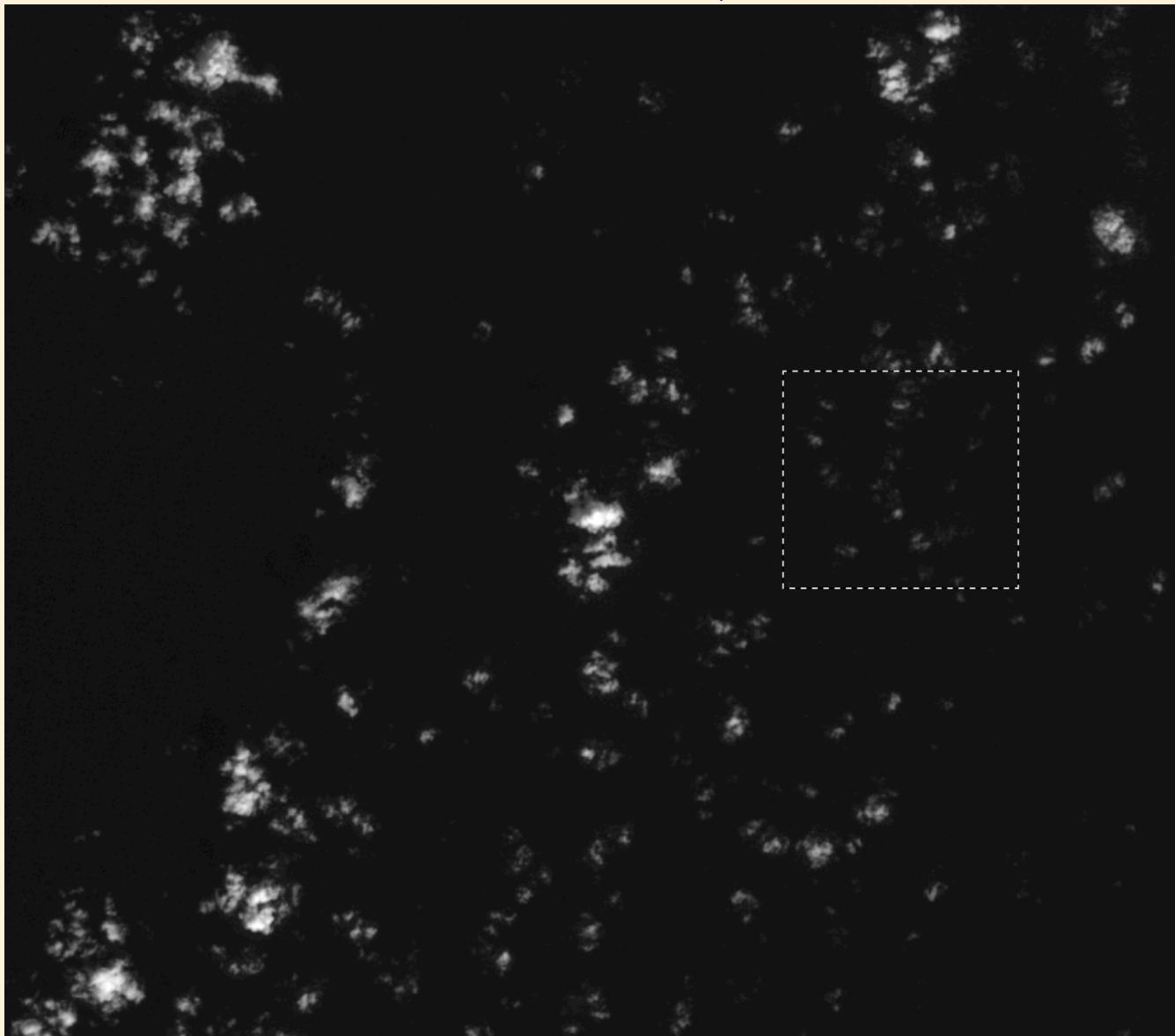
# A more detailed look



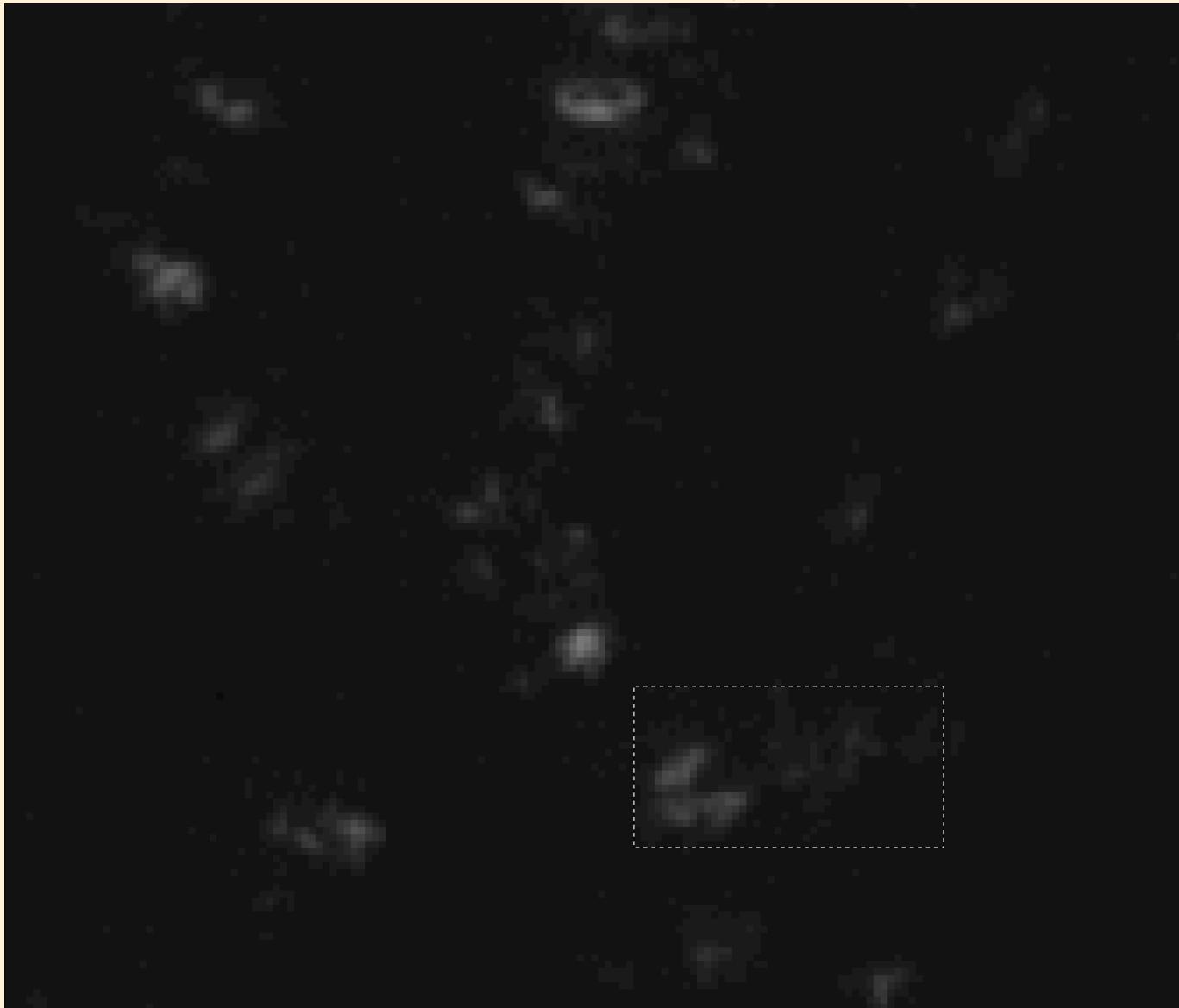
ACCA CF=6%



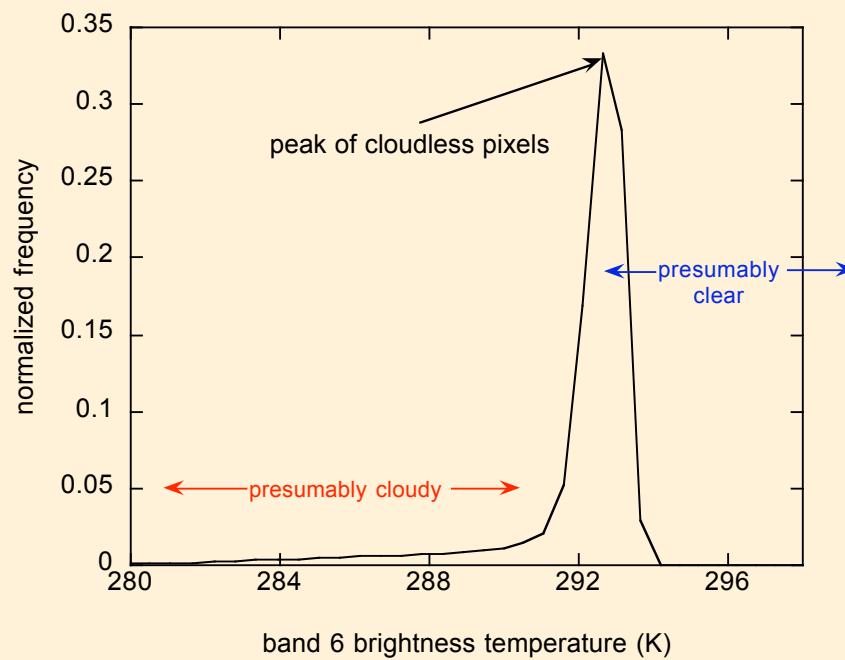
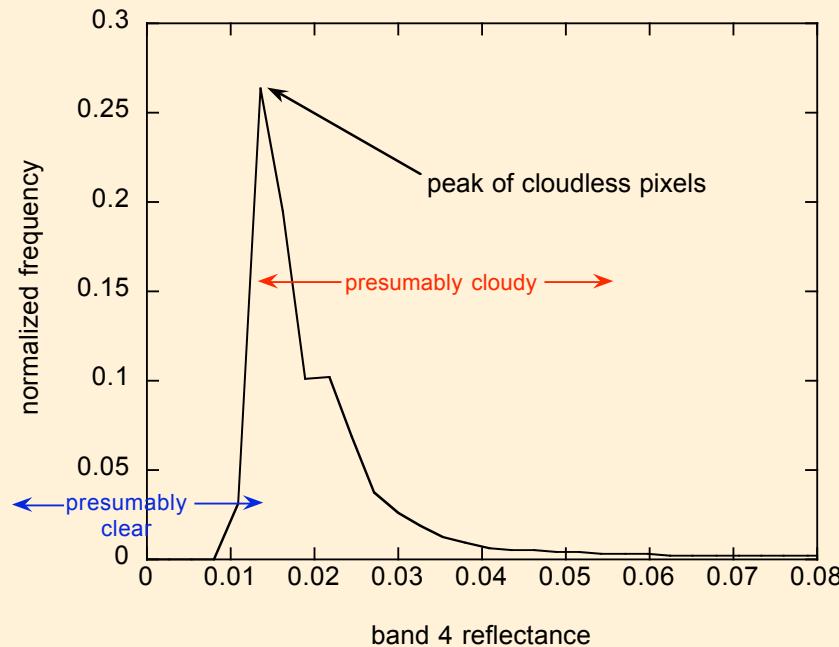
# Detail of P63/R45, 2001/2/7



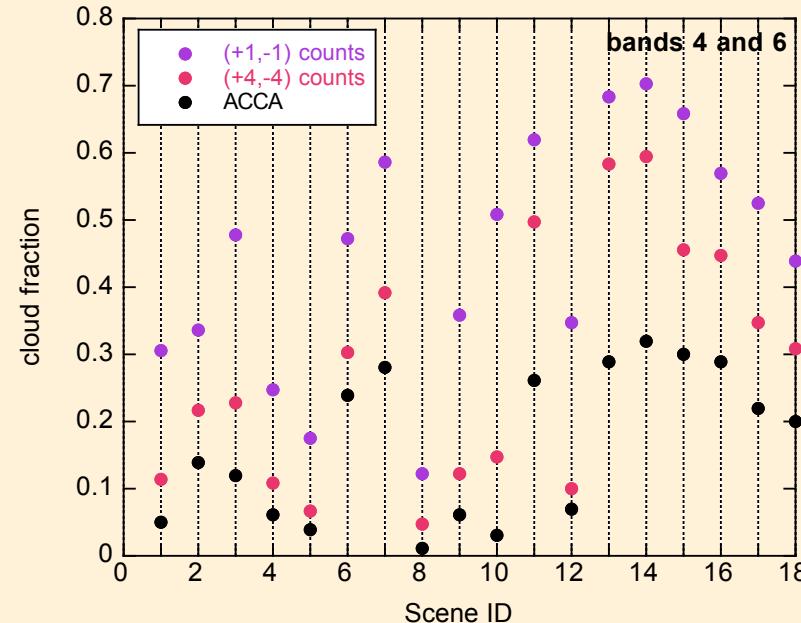
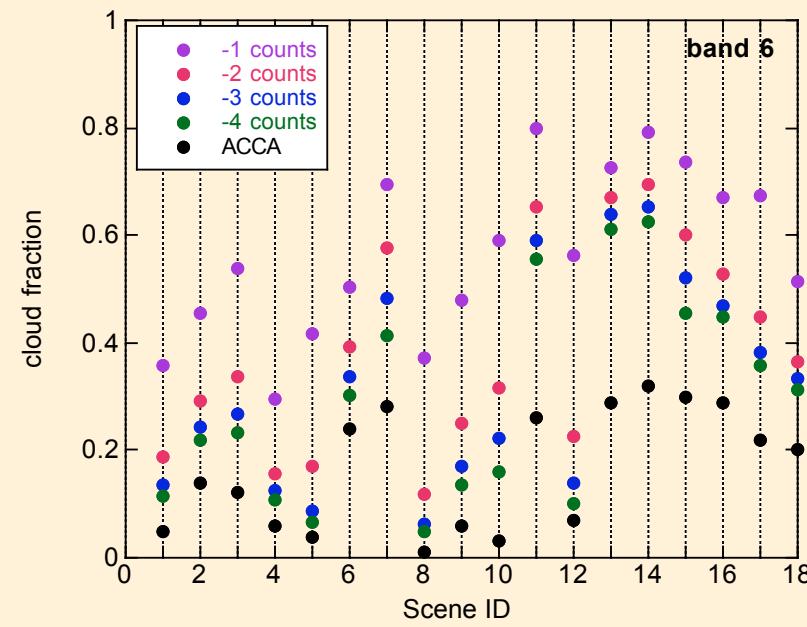
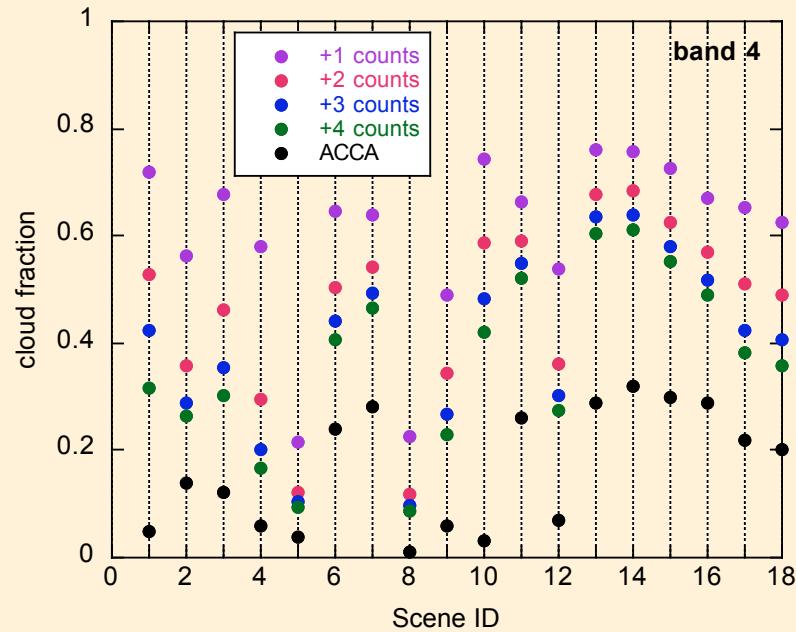
# Detail of P63/R45, 2001/2/7



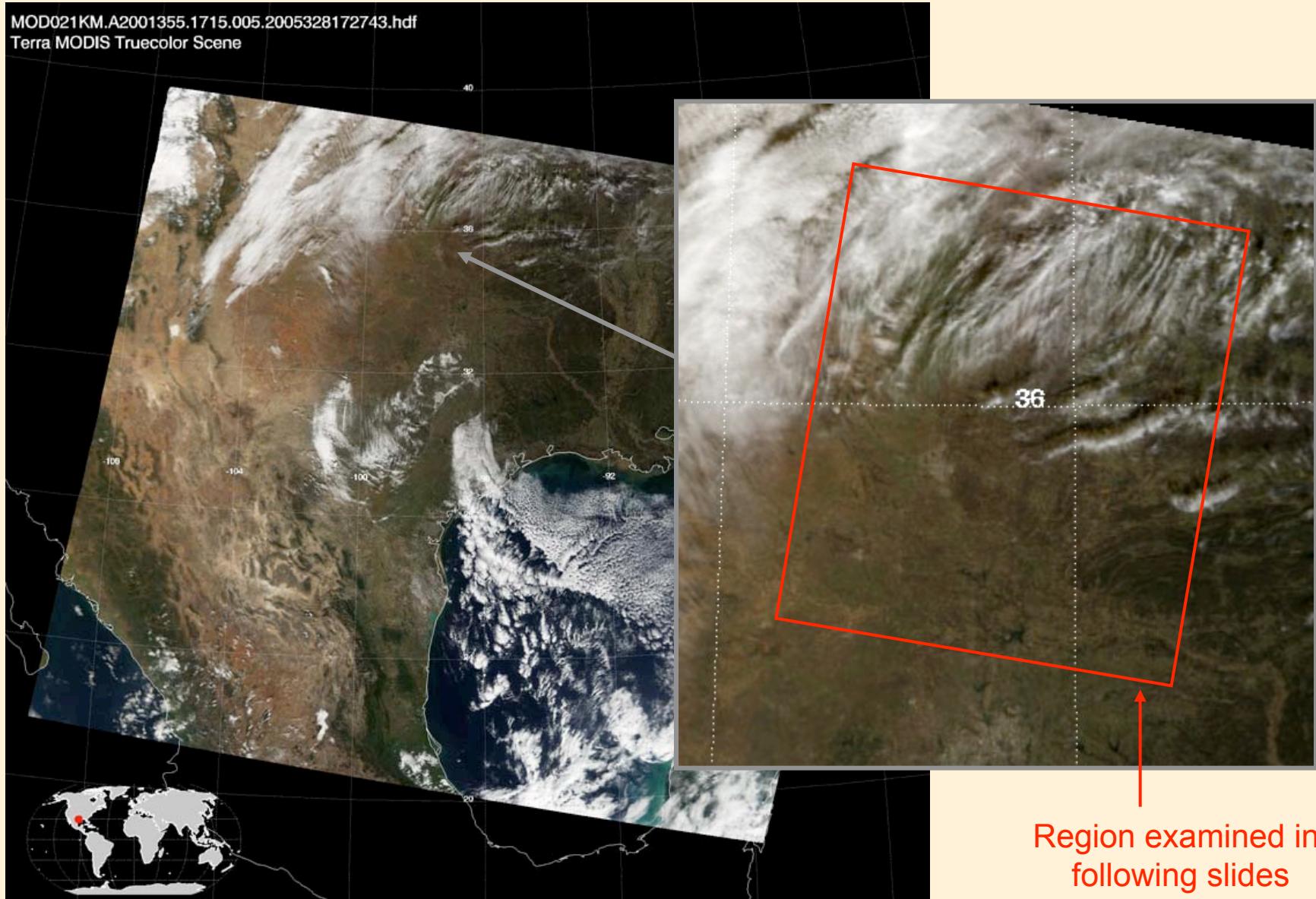
# Threshold selection

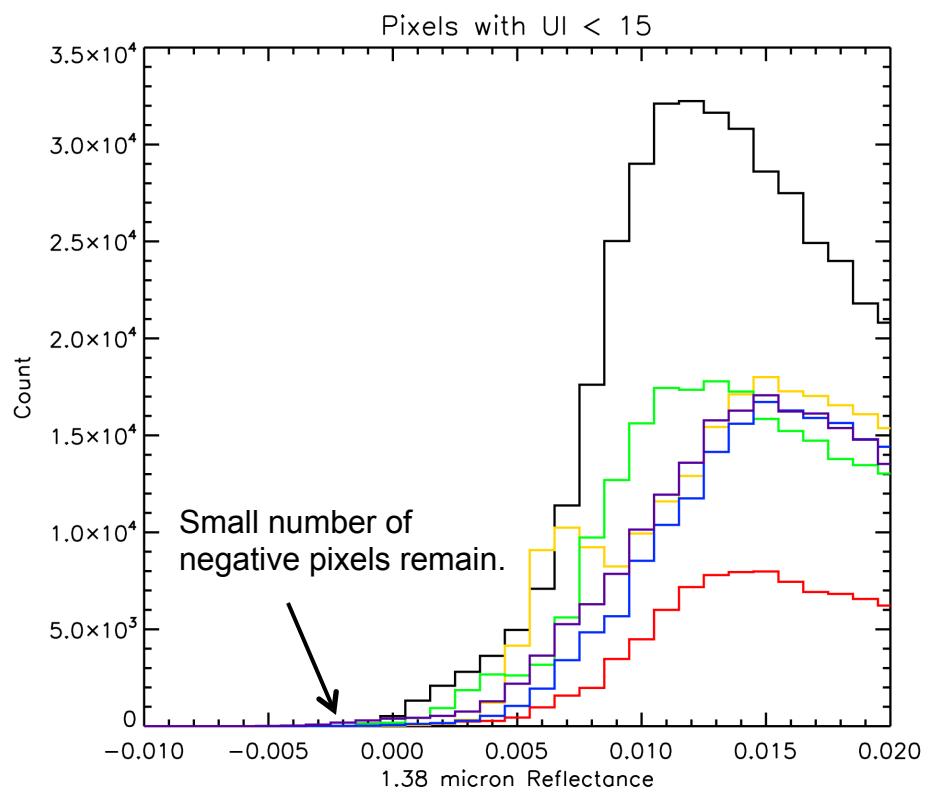
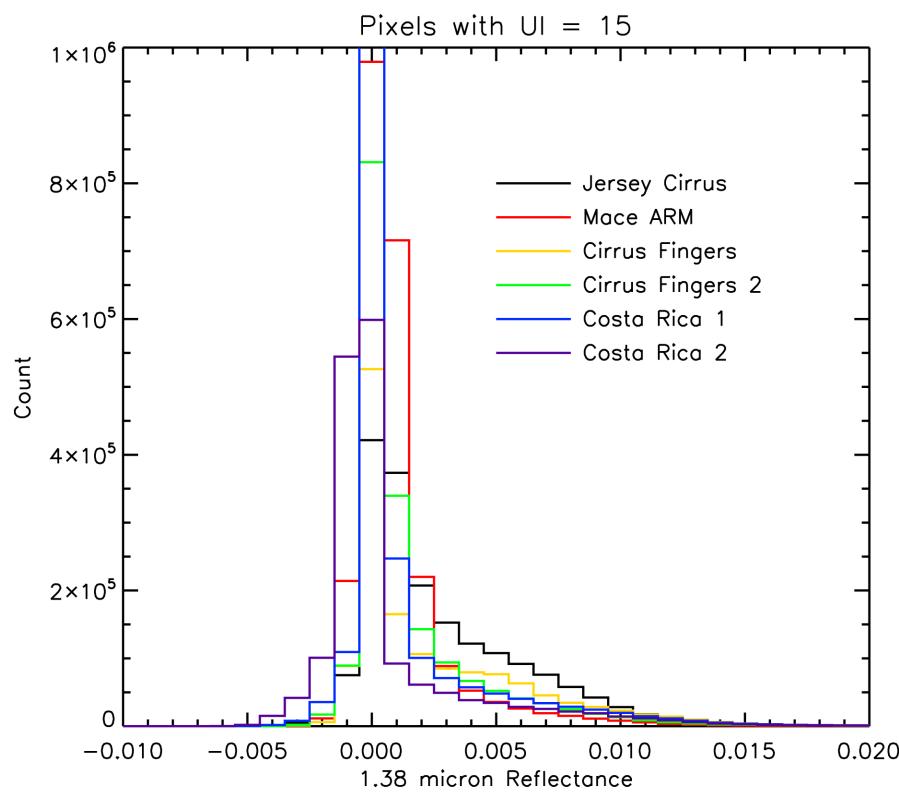


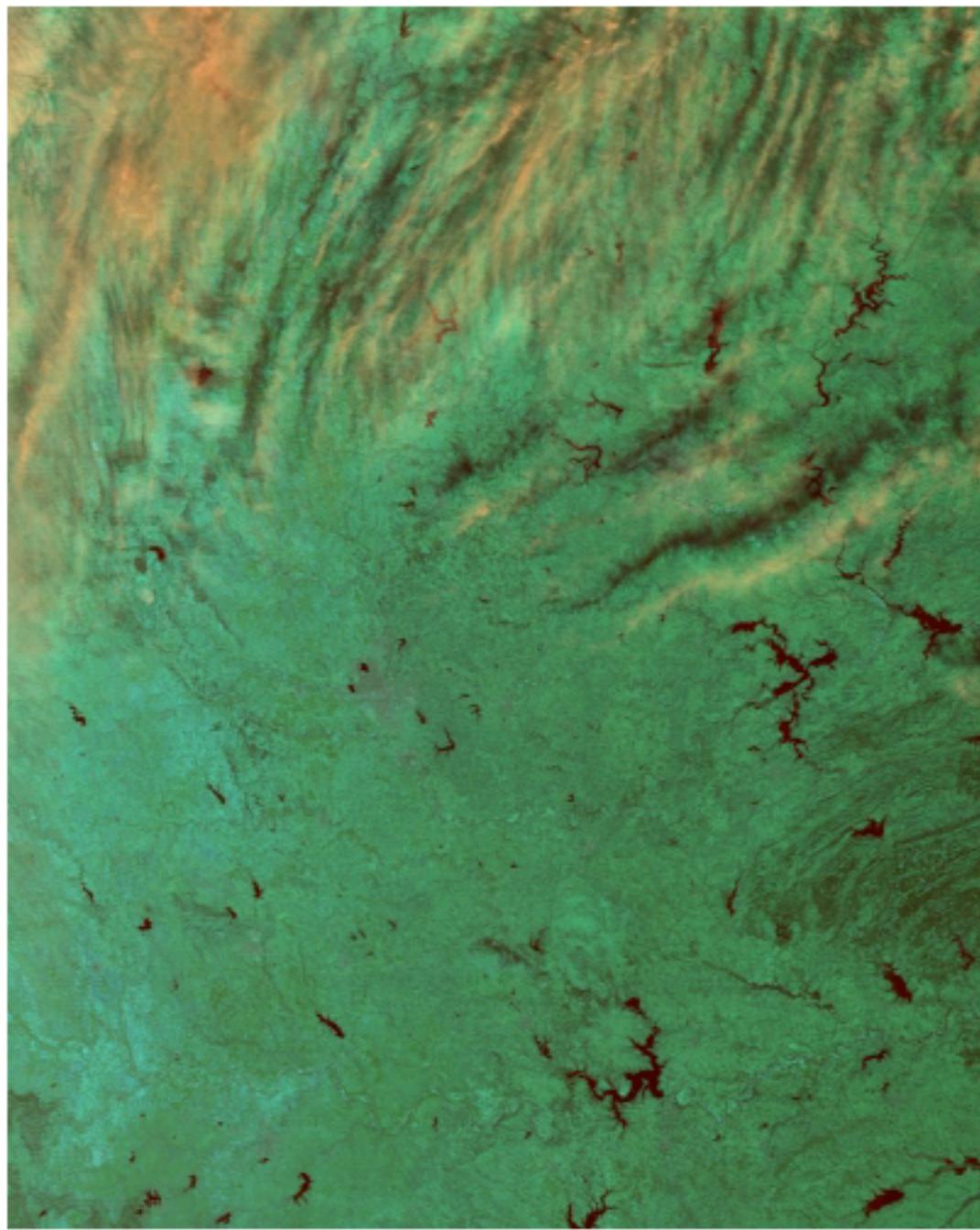
# Sensitivity to threshold



# Jay Mace ARM Case







Cirrus Reflectance Flag



Cirrus  
Pixel

Non-Cirrus  
Pixel

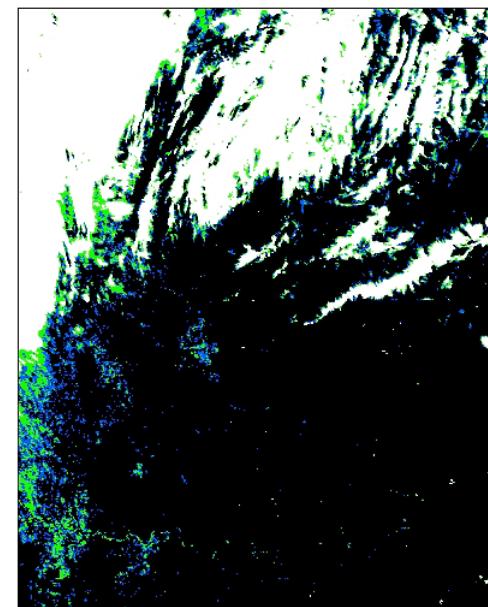
Cirrus Reflectance Flag (without UI=15)



Cirrus  
Pixel

Non-Cirrus  
Pixel

MOD06 Cloud Mask



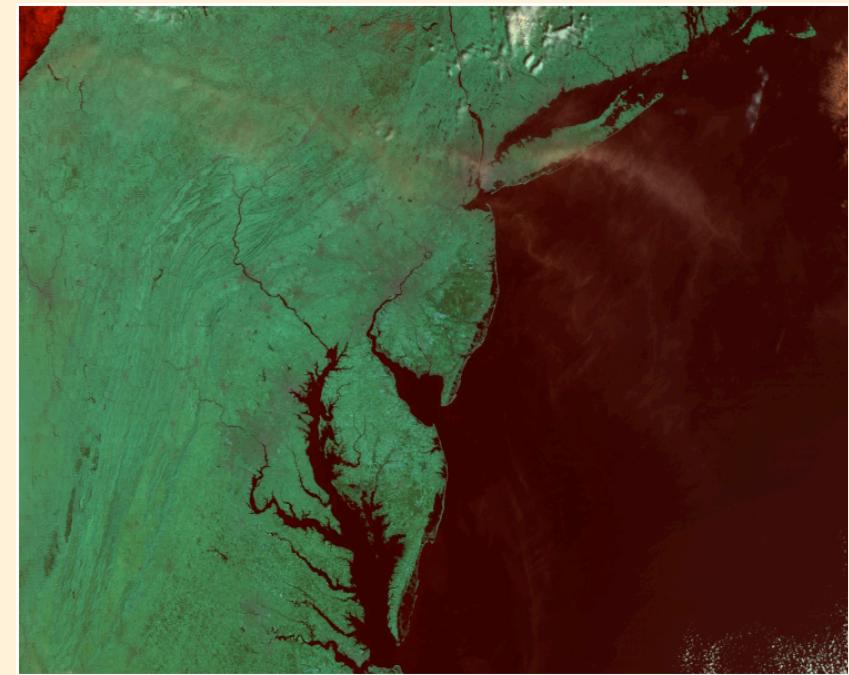
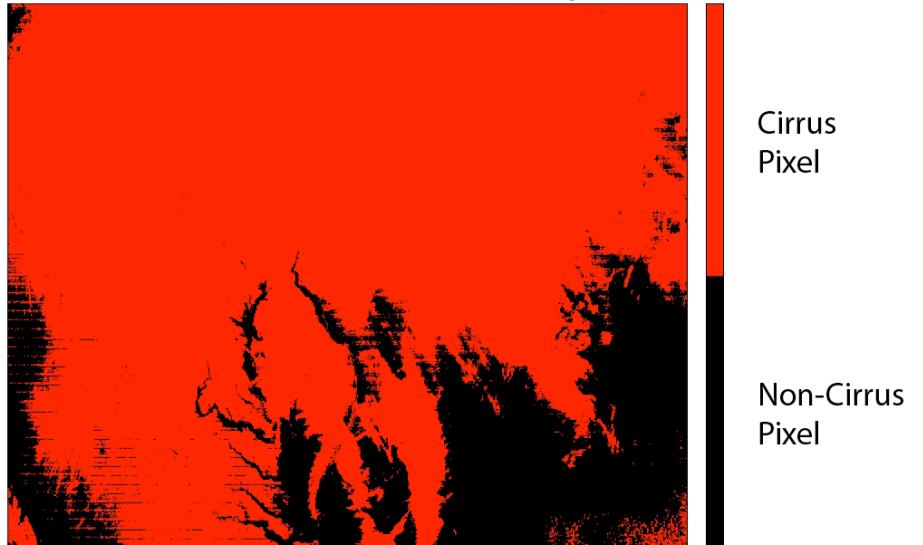
Confident  
Cloudy

Probably  
Cloudy

Probably  
Clear

Confident  
Clear

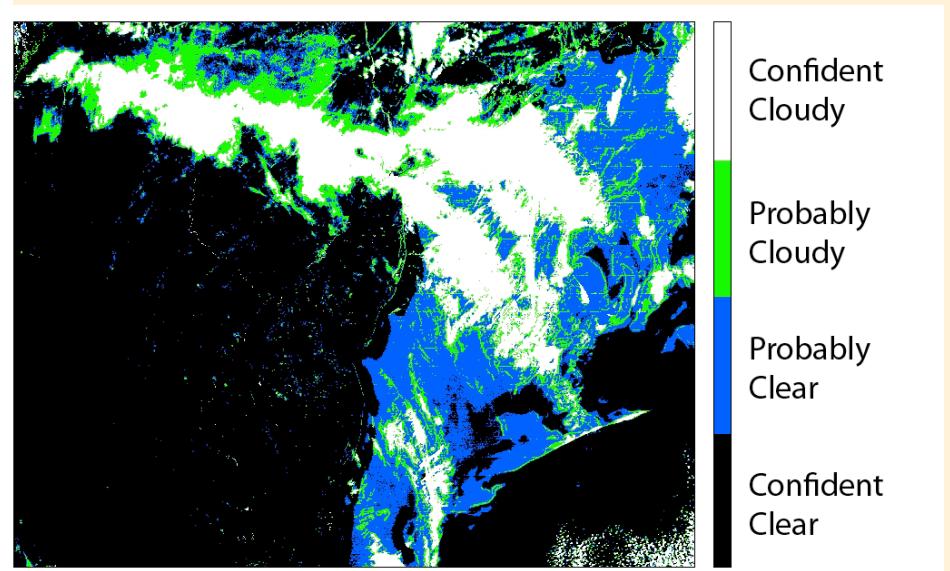
### Cirrus Reflectance Flag



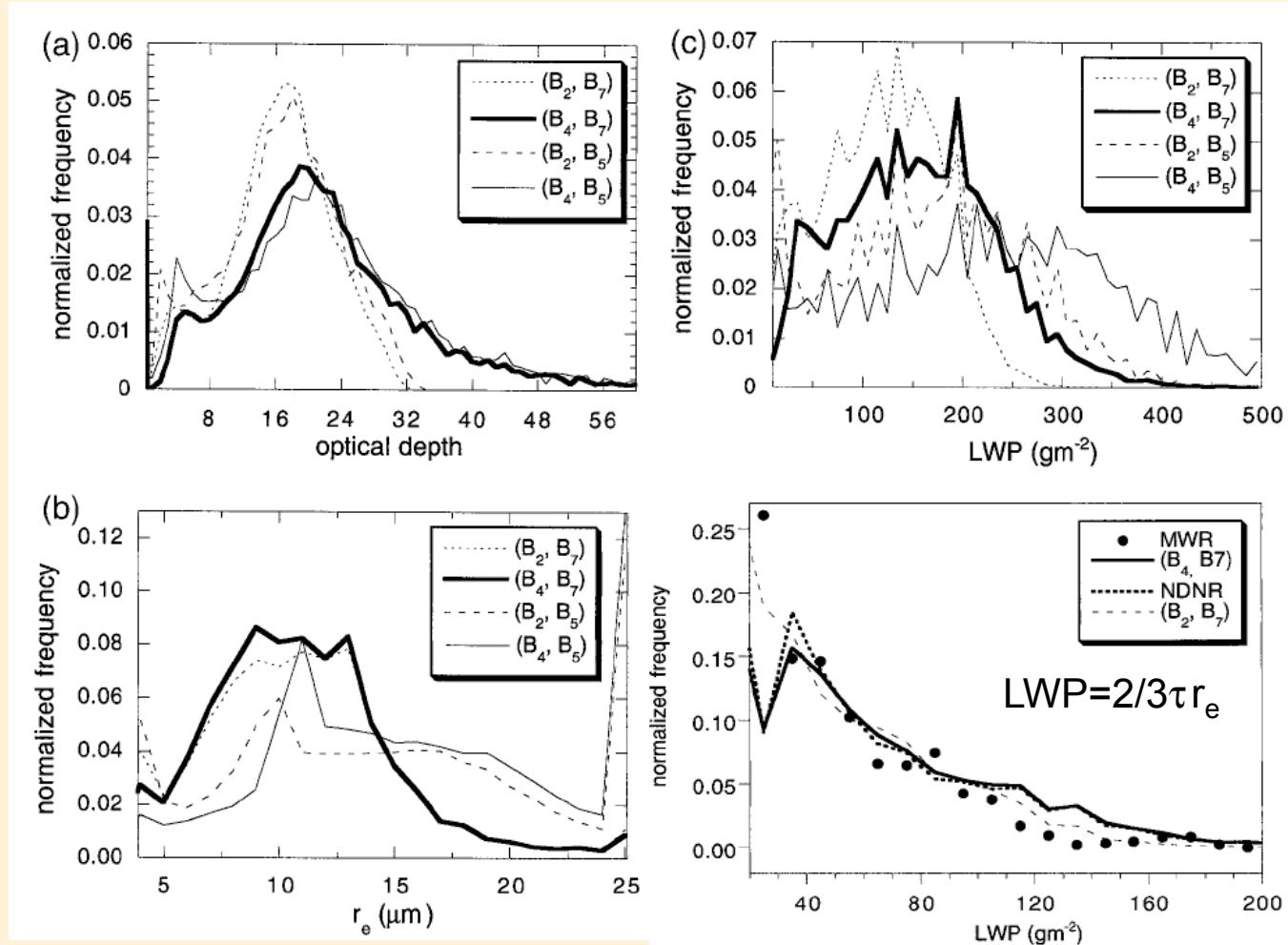
### Cirrus Reflectance Flag (with UI<15)



### MOD06 Cloud Mask

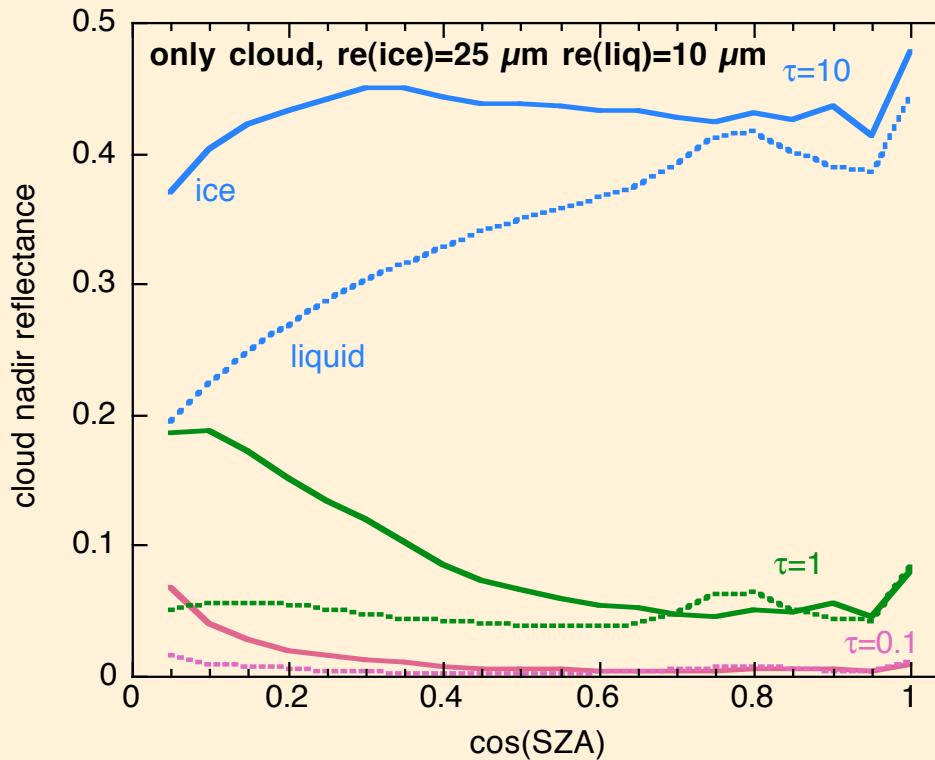


# Landsat cloud retrieval example



Oreopoulos et al. (2000)

# Theoretical 1.38 $\mu\text{m}$ studies with a MODIS reflectance simulator (Meyer, Platnick)



TOA 1.38  $\mu\text{m}$  nadir reflectance depends on:

- Solar zenith angle
- Surface albedo (BDRF)
- Total column water vapor
- Profile of water vapor
- Cloud phase, vertical location, optical thickness, effective particle size